SMEFT at future lepton colliders with machine learning

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Why SMEFT at future lepton colliders?

- ► Build large colliders → go to high energy → discover new particles!
- Higgs and nothing else?
- What's next?
 - ▶ Build an even larger collider (~ 100 TeV)?
 - No guaranteed discovery!

Why SMEFT at future lepton colliders?

- ► Build large colliders → go to high energy → discover new particles!
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- What's next?
 - ► Build an even larger collider (~ 100 TeV)?
 - No guaranteed discovery!
- \blacktriangleright Build large colliders \rightarrow do precision measurements \rightarrow probe new physics!
 - Higgs factory! (HL-LHC, or a future lepton collider)
 - Many other precision measurements! (Z, W, top, ...)
 - Standard Model Effective Field Theory (model independent approach)

To summarize in one sentence...



"Our future discoveries must be looked for in the sixth place of decimals."

- Albert A. Michelson

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The Standard Model Effective Field Theory



- $[\mathcal{L}_{sm}] \leq 4$. Why?
 - Bad things happen when we have non-renormalizable operators!
 - Everything is fine as long as we are happy with finite precision in perturbative calculation.
- ► **d=5:** $\frac{c}{\Lambda}LLHH \sim \frac{cv^2}{\Lambda}\nu\nu$, Majorana neutrino mass.
- Assuming Baryon and Lepton numbers are conserved,

$$\mathcal{L}_{\text{SMEFT}} = \mathcal{L}_{\text{SM}} + \sum_{i} \frac{\boldsymbol{c}_{i}^{(6)}}{\Lambda^{2}} \mathcal{O}_{i}^{(6)} + \sum_{j} \frac{\boldsymbol{c}_{j}^{(8)}}{\Lambda^{4}} \mathcal{O}_{j}^{(8)} + \cdots$$

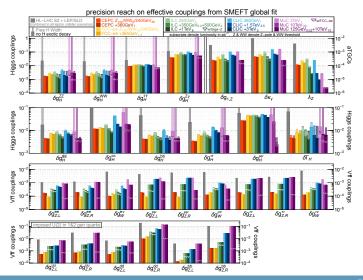
If Λ ≫ v, E, then SM + dimension-6 operators are sufficient to parameterize the physics around the electroweak scale.

X^{1}		φ^4 and $\varphi^4 D^2$		$\psi^{2}\varphi^{3}$		(LL)(LL)		$(\bar{R}R)(\bar{R}R)$		(LL)(RR)	
Q_G $Q_{\tilde{G}}$ Q_W Q_{W}	$\begin{array}{l} f^{ABC}G^{Aj}_{\mu}G^{Bj}_{\nu}G^{C\mu}_{\nu}\\ f^{ABC}\widetilde{G}^{Aj}_{\mu}G^{Bj}_{\nu}G^{C\mu}_{\nu}\\ s^{IJK}W^{Ij}_{\mu}W^{J\mu}_{\nu}W^{J\mu}_{\mu}\\ s^{IJK}\widetilde{W}^{Ij}_{\mu}W^{J\mu}_{\nu}W^{K\mu}_{\mu}\\ s^{IJK}\widetilde{W}^{Ij}_{\mu}W^{J\mu}_{\nu}W^{K\mu}_{\mu} \end{array}$	$\begin{array}{c} Q_{\mu} \\ Q_{\mu \Omega} \\ Q_{\mu D} \end{array}$	$\begin{array}{c} (\varphi^{\dagger}\varphi)^{3} \\ (\varphi^{\dagger}\varphi) \Box (\varphi^{\dagger}\varphi) \\ (\varphi^{\dagger}D^{s}\varphi)^{*} (\varphi^{\dagger}D_{s}\varphi) \end{array}$	Q _{rr} Q _{uy} Q _{sb}	$(\varphi^{\dagger}\varphi)(\overline{l}_{p}c,\varphi)$ $(\varphi^{\dagger}\varphi)(\overline{q}_{p}u,\overline{\varphi})$ $(\varphi^{\dagger}\varphi)(\overline{q}_{p}d,\varphi)$	Q_{2}^{i} $Q_{2}^{(1)}$ $Q_{2}^{(2)}$ $Q_{2}^{(2)}$ $Q_{1}^{(2)}$	$ \begin{array}{c} (\bar{l}_{l}\gamma_{1}l_{r})(\bar{l}_{l}\gamma^{\mu}l_{l}) \\ (\bar{q}_{l}\gamma_{1}q_{r})(\bar{q}_{l}\gamma^{\mu}q_{l}) \\ (\bar{q}_{l}\gamma_{1}q_{r})(\bar{q}_{l}\gamma^{\mu}\gamma^{\mu}q_{l}) \\ (\bar{q}_{l}\gamma_{1}q_{r})(\bar{q}_{l}\gamma^{\mu}\gamma^{\mu}q_{l}) \\ (\bar{l}_{l}\gamma_{l}q_{r})(\bar{q}_{l}\gamma^{\mu}q_{l}) \end{array} $	Q_{cc} Q_{ca} Q_{ca} Q_{ca}	$\begin{array}{c} (\bar{c}_{\mu}\gamma_{\mu}c_{\nu})(\bar{c}_{\nu}\gamma^{\mu}c_{\ell}) \\ (\bar{a}_{\mu}\gamma_{\mu}u_{\nu})(\bar{a}_{\nu}\gamma^{\mu}u_{\ell}) \\ (\bar{d}_{\mu}\gamma_{\mu}d_{\nu})(\bar{d}_{\nu}\gamma^{\mu}d_{\ell}) \\ (\bar{c}_{\mu}\gamma_{\mu}c_{\nu})(\bar{a}_{\nu}\gamma^{\mu}u_{\ell}) \end{array}$		$\begin{split} &(\tilde{l}_{g}\gamma_{\mu}l_{\tau})(\tilde{e}_{i}\gamma^{\mu}e_{i})\\ &(\tilde{l}_{\mu}\gamma_{\mu}l_{\tau})(\tilde{e}_{i}\gamma^{\mu}a_{i})\\ &(\tilde{l}_{\mu}\gamma_{\mu}l_{\tau})(\tilde{e}_{i}\gamma^{\mu}a_{i})\\ &(\tilde{l}_{\mu}\gamma_{\mu}l_{\tau})(\tilde{e}_{i}\gamma^{\mu}e_{i}) \end{split}$
$Q_{\mu\sigma}$ $Q_{\mu\bar{\sigma}}$	$\chi^2 \varphi^2$ $\varphi^{\dagger} \varphi G^{h}_{\mu\nu} G^{A\mu\nu}$ $\varphi^{\dagger} \varphi \overline{G}^{h}_{\mu\nu} G^{A\mu\nu}$	Q _{el} w Q _{ell}	$\psi^2 X \varphi$ $(\bar{l}_{\rho} \sigma^{ee} e_r) \tau^I \varphi W^I_{\mu\nu}$ $(\bar{l}_{\rho} \sigma^{ee} e_r) \varphi B_{\mu\nu}$	$\begin{array}{c} Q^{(1)}_{arphi} \\ Q^{(2)}_{arphi} \end{array}$	$\psi^2 \varphi^2 D$ $\langle \varphi^{\dagger} i \vec{D}_{\mu} \varphi \rangle (\vec{l}_{\mu} \gamma^{\mu} l_{\tau})$ $\langle \varphi^{\dagger} i \vec{D}_{\mu}^{f} \varphi \rangle (\vec{l}_{\mu} \tau^{\tau} \gamma^{\mu} l_{\tau})$	Q.4	$(\tilde{l}_p \gamma_p \tau^f l_r)(\tilde{q}_r \gamma^\mu \tau^f q_t)$	$\begin{array}{c} Q_{cd} \\ Q_{cd}^{(1)} \\ Q_{cd}^{(2)} \\ Q_{cd}^{(2)} \end{array}$	$\begin{array}{c} (\bar{e}_{y}\gamma_{y}e_{r})(\bar{d}_{r}\gamma^{s}d_{t}) \\ (\bar{u}_{y}\gamma_{y}u_{r})(\bar{d}_{r}\gamma^{s}d_{t}) \\ (\bar{u}_{y}\gamma_{x}T^{4}u_{r})(\bar{d}_{r}\gamma^{s}T^{4}d_{t}) \end{array}$	A A B B A A A	$(\bar{q}_i \gamma_i q_r)(\bar{u}_i \gamma^a u_i)$ $(\bar{q}_i \gamma_i T^A q_r)(\bar{u}_i \gamma^a T^A u_i)$ $(\bar{q}_i \gamma_i d_r)(\bar{d}_i \gamma^a d_r)$ $(\bar{q}_i \gamma_i T^A q_r)(\bar{d}_i \gamma^a T^A d_r)$
$\begin{array}{c} Q_{qW} \\ Q_{qW} \\ Q_{qW} \\ Q_{pS} \end{array}$	$\varphi^{\dagger}\varphi W^{I}_{\mu\nu}W^{I}\mu\nu$ $\varphi^{\dagger}\varphi \widetilde{W}^{I}_{\mu\nu}W^{I}\mu\nu$ $\varphi^{\dagger}\varphi B_{\mu\nu}B^{\mu\nu}$	$\begin{array}{c} Q_{uG} \\ Q_{uW} \\ Q_{uS} \end{array}$	$\begin{array}{l} (\bar{q}_{\mu}\sigma^{\mu\nu}T^{4}u_{\nu})\overline{\varphi}G^{4}_{\mu\nu}\\ (\bar{q}_{\mu}\sigma^{\mu\nu}u_{\nu})\tau^{I}\widetilde{\varphi}W^{I}_{\mu\nu}\\ (\bar{q}_{\mu}\sigma^{\mu\nu}u_{\nu})\overline{\varphi}B_{\mu\nu} \end{array}$	$\begin{array}{c} Q_{qq} \\ Q_{qq}^{(1)} \\ Q_{qq}^{(2)} \\ Q_{qq}^{(3)} \end{array}$	$(\varphi^{\dagger}i \vec{D}_{\mu} \varphi)(\vec{e}_{\nu} \gamma^{\mu} e_{\nu})$ $(\varphi^{\dagger}i \vec{D}_{\mu} \varphi)(\vec{q}_{\nu} \gamma^{\mu} q_{\nu})$ $(\varphi^{\dagger}i \vec{D}_{\mu}^{I} \varphi)(\vec{q}_{\nu} \tau^{I} \gamma^{\mu} q_{\nu})$ $\overset{\circ}{\underset{\rightarrow}{\rightarrow}}$	Q_{lodg} $Q_{quipl}^{(1)}$	$(\hat{R}L)$ and 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$^{T}Cu_{i}^{d}\left[\left(q_{i}^{ci}\right)^{T}Cl_{i}^{b}\right]$ $^{T}Cq_{i}^{cb}\left[\left(u_{i}^{c}\right)^{T}Cv_{i}\right]$	
$\begin{array}{c} Q_{\mu\bar{k}} \\ Q_{\mu\bar{k}B} \\ Q_{\mu\bar{k}B} \end{array}$	$\varphi^{\dagger}\varphi \overline{B}_{\mu\nu}B^{\mu\nu}$ $\varphi^{\dagger}\tau^{J}\varphi W^{J}_{\mu\nu}B^{\mu\nu}$ $\varphi^{\dagger}\tau^{J}\varphi \widetilde{W}^{J}_{\mu\nu}B^{\mu\nu}$	Qaa Qaw Qaw	$(\bar{q}_{\mu}\sigma^{\mu\nu}T^{A}d_{\nu})\varphi G^{A}_{\mu\nu}$ $(\bar{q}_{\mu}\sigma^{\mu\nu}d_{\nu})\tau^{I}\varphi W^{I}_{\mu\nu}$ $(\bar{q}_{\mu}\sigma^{\mu\nu}d_{\nu})\varphi B_{\mu\nu}$	Q_{ga} Q_{gd} Q_{gad}	$(\varphi^{\dagger} i \widetilde{D}_{\mu} \varphi) (\bar{u}_{p} \gamma^{\mu} u_{r})$ $(\varphi^{\dagger} i \widetilde{D}_{\mu} \varphi) (\bar{d}_{p} \gamma^{\mu} d_{r})$ $i (\hat{\varphi}^{\dagger} D_{\mu} \varphi) (\bar{u}_{p} \gamma^{\mu} d_{r})$	$\begin{array}{c} Q^{(0)}_{gapl} \\ Q^{(0)}_{logs} \\ Q^{(2)}_{logs} \end{array}$	$\begin{array}{l} \langle q_j^i T^{\cdot i} u_r \rangle v_{jk} (q_s^j T^{\cdot i} d_i) \\ \langle l_p^j c_r \rangle c_{jk} (\dot{q}_s^j u_i) \\ (\dot{l}_p^j c_{\mu} c_{\nu}) c_{jk} (\dot{q}_s^j u_i) \end{array}$	$Q_{em}^{(1)}$ $Q_{em}^{(2)}$ Q_{em}	$e^{\alpha\beta\gamma} e_{\beta\beta} e_{\alpha\alpha} [(q_{\mu}^{\alpha})^T C q_{\mu}^{\alpha\beta}] [(q_{\mu}^{\alpha\alpha\gamma})^T C l_{\mu}^{\alpha}]$ $e^{\alpha\beta\gamma} (\tau^{\dagger} c)_{\beta\beta} (\tau^{\dagger} c)_{\alpha\alpha} [(q_{\mu}^{\alpha\gamma})^T C q_{\mu}^{\alpha\beta}] [(q_{\mu}^{\alpha\alpha\gamma})^T C l_{\mu}^{\alpha}]$ $e^{\alpha\beta\gamma} [(d_{\mu}^{\alpha\gamma})^T C l_{\mu}^{\beta}] [(u_{\mu}^{\alpha\gamma})^T C r_{r_{\mu}}]$		

- Write down all possible (non-redundant) dimension-6 operators ...
- 59 operators (76 parameters) for 1 generation, or 2499 parameters for 3 generations. [arXiv:1008.4884] Grzadkowski, Iskrzyński, Misiak, Rosiek, [arXiv:1312.2014] Alonso, Jenkins, Manohar, Trott.
- A full global fit with all measurements to all operator coefficients?
 - ► We usually only need to deal with a subset of them, *e.g.* ~ 20-30 parameters for **Higgs and electroweak** measurements.
- Do a global fit and present the results with some fancy bar plots!

Higgs + EW, Results from the Snowmass 2021 (2022) study

[2206.08326] de Blas, Du, Grojean, JG, Miralles, Peskin, Tian, Vos, Vryonidou

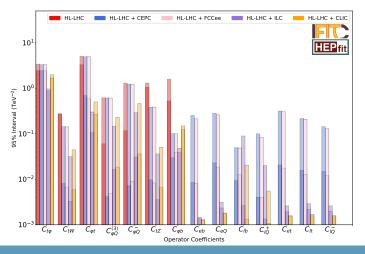


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Top operators with $e^+e^- ightarrow tar{t}$

[2206.08326] de Blas, Du, Grojean, JG, Miralles, Peskin, Tian, Vos, Vryonidou

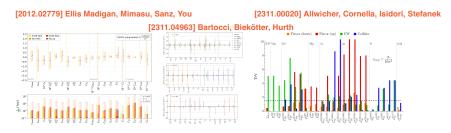


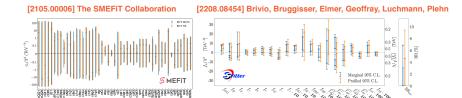
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Many studies on SMEFT global fits!





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Machine learning is not physics!





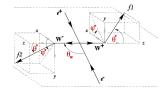
- ▶ [2401.02474] Shengdu Chai, JG, Lingfeng Li on $e^+e^- \rightarrow W^+W^-$.
- Many studies!
 - [1805.00013, 1805.00020] Brehmer, Cranmer, Louppe, Pavez,
 [2007.10356] Chen, Glioti, Panico, Wulzer (*pp* → *ZW*),
 [2211.02058] Ambrosio, Hoeve, Madigan, Rojo, Sanz (*pp* → *tt*, *pp* → *hZ*),

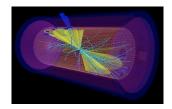
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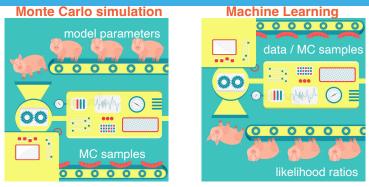
Why Machine learning in SMEFT analyses?

- In many cases, the new physics contributions are sensitive to the differential distributions.
 - $e^+e^- \rightarrow W^+W^- \rightarrow 4f \Rightarrow 5$ angles
 - ► $e^+e^- \rightarrow t\bar{t} \rightarrow bW^+\bar{b}W^- \rightarrow 6f$ \Rightarrow 9 angles
 - How to extract information from the differential distribution?
 - ► If we have the full knowledge of $\frac{d\sigma}{d\Omega} \Rightarrow$ matrix-element method, optimal observables...
- The ideal $\frac{d\sigma}{d\Omega}$ we can calculate is not the $\frac{d\sigma}{d\Omega}$ that we actually measure!
 - detector acceptance, measurement uncertainties, ISR/beamstrahlung ...
 - In practice we only have MC samples, not analytic expressions, for do/do.





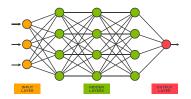
The "inverse problem"



- ► Forward: From model parameters we can calculate the ideal $\frac{d\sigma}{d\Omega}$, simulate complicated effects and produce MC samples.
- Inverse: From data / MC samples, how do we know the model parameters?
- With Neural Network we can (in principle) reconstruct $\frac{d\sigma}{d\Omega}$ (or likelihood ratios) from MC samples.

- We have a theory (SMEFT) that gives a differential cross section d
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- For simplicity, let's ignore the total rate and focus on $\frac{1}{\sigma} \frac{d\sigma}{d\Omega} \equiv p(\mathbf{x}|\mathbf{c})$, *i.e.* it's a probability density function of the observables \mathbf{x} .
- ► Define the likelihood function $\mathcal{L}(\mathbf{c}|\mathbf{x}) \equiv p(\mathbf{x}|\mathbf{c})$. For a sample of *N* events, maximizing the total likelihood $\prod_{i=1}^{N} \mathcal{L}(\mathbf{c}|\mathbf{x}_i)$ (or the log likelihood) gives the best estimator for **c**. (matrix-element method)
- ► For two model points c_0 and c_1 , the likelihood ratio $r(\mathbf{x}|\mathbf{c}_0, \mathbf{c}_1) = \frac{p(\mathbf{x}|\mathbf{c}_0)}{p(\mathbf{x}|\mathbf{c}_1)}$ provides the optimal statistical test (Neyman–Pearson lemma).
 - We usually set c_1 to be SM.

A rough sketch

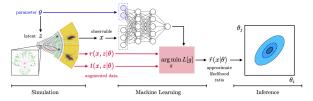


- We do not know p(x|c) or $r(\mathbf{x}|\mathbf{c}_0, \mathbf{c}_1)$, but we can use neural network to construct an estimator $\hat{r}(\mathbf{x}|\mathbf{c}_0, \mathbf{c}_1)$ and a loss function(al) $L(\hat{r})$ which is minimized when $\hat{r} = r$.
- By minimizing $L(\hat{r})$ with respect to \hat{r} we can find the true r in the ideal limit (large sample, perfect training).
- There are many ways to construct a loss function(al)....
- With additional assumptions on how dσ/dΩ depends on c (*i.e.*, a linear or a quadratic relation), we only need to train a finite number of times to obtain an estimator r(x|c₀, c₁) for any c₀.

Particle physics structure

• One could make use of latent variable "*z*" (the parton level analytic result for $\frac{d\sigma}{d\Omega}$) to increase the performance of ML.

[1805.00013, 1805.00020] Brehmer, Cranmer, Louppe, Pavez



• Assuming linear dependences $\frac{d\sigma}{d\Omega} = S_0 + \sum_i S_{1,i} c_i$, there is a method

called SALLY (Score approximates likelihood locally).

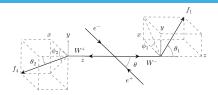
- ► In this case, for each parameter we only need to train once to obtain $\alpha_i \equiv \frac{S_{1,i}}{S_0}$. (It is basically the ML version of Optimal Observables.)
- We can calculate the "ideal" $\alpha(z)$ which will help us train the actual $\alpha(x)$.

$$L[\hat{\alpha}(\mathbf{x})] = \sum_{\mathbf{x}_i, \mathbf{z}_i \sim \mathrm{SM}} |\alpha(\mathbf{z}_i) - \hat{\alpha}(\mathbf{x}_i)|^2.$$

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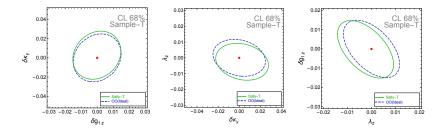
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The ML analysis of $e^+e^- ightarrow W^+W^-$



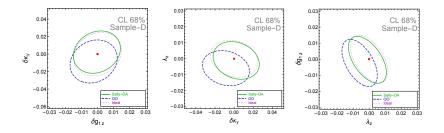
- ▶ $e^+e^- \rightarrow W^+W^-$, 240 GeV, unpolarized beams, semileptonic channel.
- Training sample: 2×10^6 events. Validation sample: 5×10^5 events.
 - This is much smaller than the actual data set ($\sim 10^8$ events) we will have!
- MadGraph/Pythia/Delphes, ILD-like detector card, IRS implemented.
- ▶ Background: $e^+e^- \rightarrow ZZ \rightarrow jj\ell^+\ell^-$ with a missing lepton.
- Inputs: particle 4 momenta + 5 reconstructed angles.
- Fully connected neural network (FCNN), 9 layers and 200 nodes each layer.

3-aTGC fit, truth-level sample



- The results are scaled to 10^4 events.
- At the truth level, Optimal Observables (OO) gives the ideal results by construction.
- Machine learning suffers from imperfect training and has no advantage.

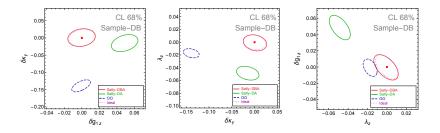
3-aTGC fit, detector-level sample



- Naively applying truth-level optimal observables to detector-level samples could lead to a large bias!
- ML model trained on detector-level samples (Sally-DA) automatically take care of the detector (and ISR) effects and are more robust.

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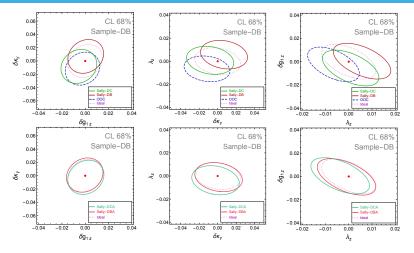
3-aTGC fit, detector-level sample with background



- 10% ZZ background. A large bias can be introduced if we failed to take account of it!
- SALLY-DBA: trained with both signal and backgrounds with the correct weighting to reconstruct the α̂(x) for the combined differential cross section.

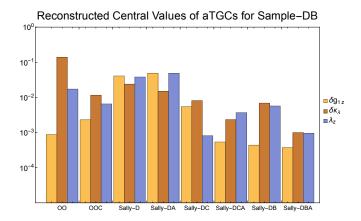
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Comparisons between methods



- OOC, Sally-DC(A): Optimal observables and Sally-D(A) combined with a classifier.
- A: averaged over 8 models to reduce the noises from the training phase.

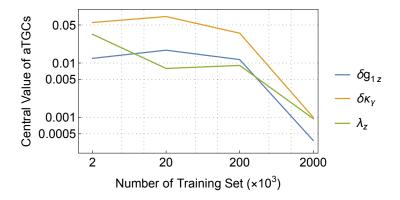
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 For the detector-level sample with background, Sally-DBA has the least bias.

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bias vs. training sample size



- ▶ The current bias is still unacceptable for future colliders with $\sim 10^8 WW$ events.
- Hopefully with more computing resources in the future, the bias can be reduced to the desired level.

We have no idea what is the new physics beyond the Standard Model.

- One important direction to move forward is to do precision measurements of the Standard Model processes.
 - HL-LHC is ok, but a future lepton collider is better!
 - SMEFT is a good theory framework (but is not everything).
- Machine learning is (likely to be) the future!
 - ► High precision ⇒ high demand on reducing biases/systematics to the same level.
 - ML helps take care of the detector/ISR/background effects.

Conclusion



When will Machine take over?

Before or after a future lepton collider is built?

Many more studies to do!

- Di-leptonic & fully hadronic channels.
- ▶ Other processes, *e.g.* $e^+e^- \rightarrow t\bar{t}$ (current work with Yifan Fei, Tong Shen, Kerun Yu),
- In reality, MC simulation does not perfectly describe data...

backup slides

Tree-level dim-6 CP-even operators: 6 parameters (excluding modifications in m_W):

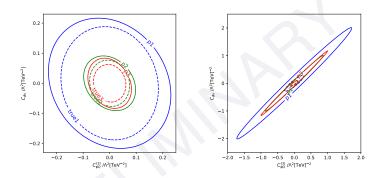
$$\delta g_{1Z}, \quad \delta \kappa_{\gamma}, \quad \lambda_{Z}, \quad \delta g_{W}^{\ell}, \quad \delta g_{Z,L}^{e}, \quad \delta g_{Z,R}^{e}.$$
(1)

$$\mathcal{L}_{\text{TGC}} = ie(W^{+}_{\mu\nu}W^{-\mu} - W^{-}_{\mu\nu}W^{+\mu})A^{\nu} + ie(1 + \delta\kappa_{\gamma})A^{\mu\nu}W^{+}_{\mu}W^{-}_{\nu} + igc_{w}\left[(1 + \delta g_{1Z})(W^{+}_{\mu\nu}W^{-\mu} - W^{-}_{\mu\nu}W^{+\mu})Z^{\nu} + (1 + \delta g_{1Z} - \frac{s^{2}_{w}}{c^{2}_{w}}\delta\kappa_{\gamma})Z^{\mu\nu}W^{+}_{\mu}W^{-}_{\nu}\right] + \frac{ig\lambda_{Z}}{m^{2}_{W}}\left(s_{w}W^{+\nu}_{\mu}W^{-\rho}_{\nu}A^{\mu}_{\rho} + c_{w}W^{+\nu}_{\mu}W^{-\rho}_{\nu}Z^{\mu}_{\rho}\right), \qquad (2)$$
$$\mathcal{L}_{Vff} = -\frac{g}{\sqrt{2}}(1 + \delta g^{\ell}_{W})\left[W^{+}_{\mu}\bar{\nu}_{L}\gamma^{\mu}e_{L} + \text{h.c.}\right]$$

$$-\frac{g}{c_{W}}Z_{\mu}\left[\bar{e}_{L}\gamma^{\mu}(-\frac{1}{2}+s_{W}^{2}+\delta g_{Z,L}^{e})e_{L}+\bar{e}_{R}\gamma^{\mu}(s_{W}^{2}+\delta g_{Z,R}^{e})e_{R}\right]+\ldots,$$
 (3)

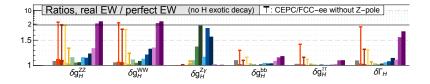
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• $e^+e^-
ightarrow t ar{t}$, 3 different channels (no background yet)

• Left: $\sqrt{s} = 1$ TeV, Right: $\sqrt{s} = 360$ GeV



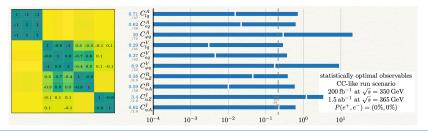
- Without good Z-pole measurements, the *eeZh* contact interaction may have a significant impact on the Higgs coupling determination.
- Current (LEP) Z-pole measurements are not good enough for CEPC/FCC-ee Higgs measurements!
 - A future Z-pole run is important!
- Linear colliders suffer less from the lack of a Z-pole run. (Win Win!)

$$\begin{array}{l} O^1_{\varphi q} \equiv \frac{y_2^2}{2} ~~\bar{q} \gamma^\mu q ~~ \varphi^\dagger i \overleftrightarrow{D}_\mu \varphi, ~~ O_{uG} \equiv y_t g_s ~~\bar{q} T^A \sigma^{\mu\nu} u ~ \epsilon \varphi^* G^A_{\mu\nu}, \\ O^3_{\varphi q} \equiv \frac{y_2^2}{2} ~~\bar{q} \tau^I \gamma^\mu q ~~ \varphi^\dagger i \overleftrightarrow{D}_\mu^I \varphi, ~~ O_{uW} \equiv y_t g_W ~~\bar{q} \tau^I \sigma^{\mu\nu} u ~ \epsilon \varphi^* W^I_{\mu\nu}, \\ O_{\varphi u} \equiv \frac{y_2^2}{2} ~~\bar{u} \gamma^\mu u ~~ \varphi^\dagger i \overleftrightarrow{D}_\mu \varphi, ~~ O_{dW} \equiv y_t g_W ~~\bar{q} \tau^I \sigma^{\mu\nu} d ~ \epsilon \varphi^* W^I_{\mu\nu}, \\ O_{\varphi u d} \equiv \frac{y_2^2}{2} ~~\bar{u} \gamma^\mu d ~~ \varphi^T \epsilon ~ i D_\mu \varphi, ~~ O_{uB} \equiv y_t g_Y ~~\bar{q} \sigma^{\mu\nu} u ~~ \epsilon \varphi^* B_{\mu\nu}, \\ O^1_{iq} \equiv \frac{1}{2} ~~\bar{q} \tau^I \gamma_\mu q ~~\bar{l} \tau^I \gamma^\mu l, \\ O^1_{iq} \equiv \frac{1}{2} ~~\bar{q} \gamma_\mu q ~~\bar{l} \gamma^\mu l, \\ O_{eq} \equiv \frac{1}{2} ~~\bar{q} \gamma_\mu q ~~\bar{l} \gamma^\mu e, \\ O_{eu} \equiv \frac{1}{2} ~~\bar{u} \gamma_\mu u ~~\bar{e} \gamma^\mu e, \end{array}$$

- Also need to include top dipole interactions and *eett* contact interactions!
- Hard to resolve the top couplings from 4f interactions with just the 365 GeV run.
 - Can't really separate $e^+e^- \rightarrow Z/\gamma \rightarrow t\bar{t}$ from

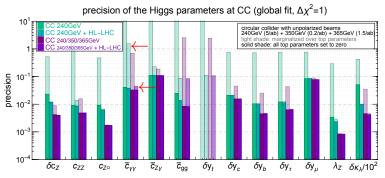
$$e^+e^-
ightarrow Z'
ightarrow tt$$
 .

Is that a big deal?

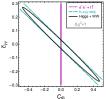


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Top operators in loops (Higgs processes) [1809.03520] G. Durieux, JG, E. Vryonidou, C. Zhang



- $O_{tB} = (\bar{Q}\sigma^{\mu\nu}t) \tilde{\varphi}B_{\mu\nu} + h.c.$ is not very well constrained at the LHC, and it generates dipole interactions that contributes to the $h\gamma\gamma$ vertex.
- Deviations in $h\gamma\gamma$ coupling \Rightarrow run at $\sim 365 \text{ GeV}$ to confirm?



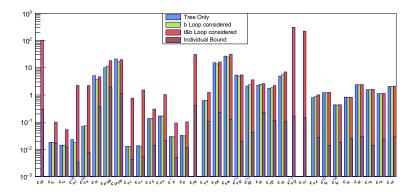
Top operators in loops (current EW processes)

[2205.05655] Y. Liu, Y. Wang, C. Zhang, L. Zhang, JG

	Experiment	Observables						
Low Energy	CHARM/CDHS/ CCFR/NuTeV/ APV/QWEAK/ PVDIS	Effective Couplings						
		Total decay width Γ_Z						
		Hadronic cross-section σ_{had}						
Z-pole	LEP/SLC	Ratio of decay width R_f						
		Forward-Backward Asymmetry A_{FB}^{f}						
		Polarized Asymmetry A_f						
	LHC/Tevatron/	Total decay width Γ_W						
W-pole	LEP/SLC	$\frac{W \text{ branching ratios } Br(W \rightarrow lv_l)}{\text{Mass of } W \text{ Boson } M_W}$						
	LEI / SLC							
		Hadronic cross-section σ_{had}						
$ee \rightarrow qq$	LEP/TRISTAN	Ratio of cross-section R_f						
		Forward-Backward Asymmetry for $b/c A_{FB}^{f}$						
		cross-section σ_f						
$ee \rightarrow ll$	LEP	Forward-Backward Asymmetry A_{FB}^{f}						
		Differential cross-section $\frac{d\sigma_f}{dcos\theta}$						
$ee \rightarrow WW$	LEP	cross-section σ_{WW}						
ec - 11 11	DE1	Differential cross-section $\frac{d\sigma_{WW}}{dcos\theta}$						

- Top operators (1-loop) + EW operators (tree, including bottom dipole operators)
- ► $e^+e^- \rightarrow f\bar{f}$ at different energies, $e^+e^- \rightarrow W^+W^-$.

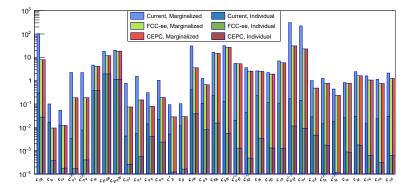
Top operators in loops (current EW processes)



Good sensitivities, but too many parameters for a global fit...

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Top operators in loops (future EW processes)



- Good sensitivities, but too many parameters for a global fit...
- It shows the importance of directly measuring $e^+e^- \rightarrow t\bar{t}$.

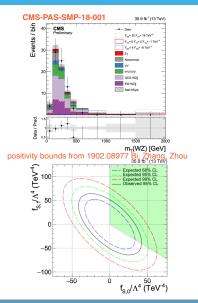
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Probing dimension-8 operators?

- The dimension-8 contribution has a large energy enhancement (~ E⁴/Λ⁴)!
- It is difficult for LHC to probe these bounds.
 - Low statistics in the high energy bins.
 - Example: Vector boson scattering.
 - Λ ≤ √s, the EFT expansion breaks down!
- Can we separate the dim-8 and dim-6 effects?
 - Precision measurements at several different √s?

(A very high energy lepton collider?)

Or find some special process where dim-8 gives the leading new physics contribution?



SMEFT at future lepton colliders with machine learning

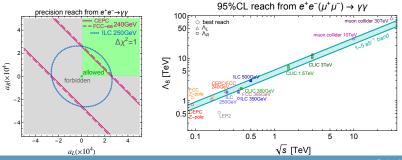
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The diphoton channel [arXiv:2011.03055] Phys.Rev.Lett. 129, 011805, JG, Lian-Tao Wang, Cen Zhang

- $e^+e^- \rightarrow \gamma\gamma$ (or $\mu^+\mu^- \rightarrow \gamma\gamma$), SM, non-resonant.
- ► Leading order contribution: dimension-8 contact interaction. $(f^+f^- \rightarrow \bar{e}_L e_L \text{ or } e_R \bar{e}_R)$

$$\mathcal{A}(f^+f^-\gamma^+\gamma^-)_{\rm SM+d8} = 2e^2 \frac{\langle 24\rangle^2}{\langle 13\rangle\langle 23\rangle} + \frac{a}{v^4} [13][23]\langle 24\rangle^2 \,.$$

Can probe dim-8 operators (and their positivity bounds) at a Higgs factory (~ 240 GeV)!



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