# Machine-Learning Yukawa couplings from String Theory

Learning Standard Model couplings on Calabi-Yau manifolds.

Kit Fraser-Taliente

based on work with Andrei Constantin, Andre Lukas, Thomas Harvey, and Burt Ovrut (2402.01615), (240X.XXXXX).



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#### String compactifications generate (moduli-dependent) couplings

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vector bundle V over smooth CY3 X(CY3 X S1/Z2)



4D N =1 chiral gauge theory



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Caveat. Proof of concept.



builde n**e**ric **D** hamonic forms

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1 chiral 4D N =gauge theory



chiral matter  $C^{I} = (c^{I}, \chi^{I})$ 

 $\mathscr{L} = -K_{I\bar{J}}\partial_{\mu}c^{I}\partial^{\mu}\bar{c}^{\bar{J}} - iK_{I\bar{J}}\bar{\chi}^{\bar{J}}\bar{\sigma}^{\mu}\partial_{\mu}\chi^{I} + e^{K_{mod}/2}(\lambda_{IJK}c^{I}\chi^{J}\chi^{K} + c.c.) + \dots$ 

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matter field Kähler metric  $K_{I\bar{J}}$ ,  $2\mathcal{V}K_{I\bar{J}} \sim \int_{V} \nu_{I} \wedge \star_{V} \nu_{J}$ 

holomorphic Yukawa couplings,  $\lambda_{IJK} \sim \int_{V} \nu_{I} \wedge \nu_{J} \wedge \nu_{K} \wedge \Omega$ 

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#### **10D** gauge theory

N = 1 SUGRA coupled to N = 1 $E_8 \times E_8$  SYM

#### particle spectrum gauge group

#### 4D N = 1 theory

matter field Kähler metric Yukawa couplings



















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#### tree level Yukawa couplings at the compactification scale
## Steps to calculate physical Yukawa couplings

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#### tree level Yukawa couplings at the compactification scale

- general method: approximate  $f \in C(X)$  with  $\theta \in \mathbb{R}^N$ , **NN architecture** specifies the map  $\mathbb{R}^N \to C(X)$ 
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(real) correction to metric:  $\phi_{\theta} : \mathbb{R}^m \to \mathbb{R}$ 

 $g_{CY,a\bar{b}} = g_{FS,a\bar{b}} + \partial_a \partial_{\bar{b}} \phi, \quad \mathscr{L}_{MA} \sim \left| 1 - \frac{1}{\kappa} \frac{\det g}{\Omega \wedge \bar{\Omega}} \right|_n$ 

'Loss functionals' (to minimise)

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$$H^E = e^{\beta} H^E_{FS}$$
, solve  $\Delta \beta = \rho_{\beta}$ ,  $\mathscr{L}_{HYM} \sim \Delta$ 

$$\left| \det g \right|_{p}$$

$$\sim \left| \Delta \beta - \rho_{\beta} \right|_{p}$$

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$$\hat{\sigma}_{\theta}: \mathbb{R}^m \to \mathbb{C}, \ \nu = \nu_{ref} + \bar{\partial}_{L_i} \sigma_{\theta}, \qquad \mathscr{L}_{one-form}$$

$$\left| A \overline{\Omega} \right|_{p}$$

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design networks  $\phi, \beta, \sigma$  that are **by construction good functions/sections** on your manifold

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Good measure of success?  $M_{MA}(\phi) = \int_{V} \left| 1 - \frac{\det g}{\Omega \wedge \Omega} \right|$ 

Good measure of success?  $M_L(\beta \text{ or } \sigma) = \frac{\int_X \left| \Delta \beta - \rho_{\beta} \right|}{c^{-1}}$ 



X: (smooth quotient of) "tetraquadric", hypersurface in  $\mathbb{P}_1 \times \mathbb{P}_1 \times \mathbb{P}_1 \times \mathbb{P}_1$ 

1-parameter family of polynomials:  $\psi$ 

$$p = \sum_{\text{even}} x_{\alpha}^2 y_{\beta}^2 u_{\gamma}^2 v_{\delta}^2 + \psi_0 \sum_{\text{odd}} x_{\alpha}^2 y_{\beta}^2 u_{\gamma}^2 v_{\delta}^2 + \psi x_0 x_1 y_0 y_1 u_0 u_1 v_0 v_1$$





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$$V = \mathcal{O}_X \begin{pmatrix} -1 & -1 & 0 & 1 & 1 \\ 0 & -3 & 1 & 1 & 1 \\ 0 & 2 & -1 & -1 & 0 \\ 1 & 2 & 0 & -1 & -2 \end{pmatrix}$$





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• no chiral exotica/vectorlike pairs



Consistent string model: precisely the **MSSM particle content** 

- ne of many known MSSM-like models
- Additional U(1) symmetries constrain couplings
- (Standard-model charged) particle content of the model:

$$\begin{array}{c} Q_{2} \\ U_{2} \\ U_{2} \\ E_{2} \end{array} \right), \ \begin{pmatrix} Q_{5} \\ U_{5} \\ E_{5} \end{array} \right), \ \begin{pmatrix} D_{2,4} \\ L_{2,4} \end{array} \right), \ 2 \begin{pmatrix} D_{4,5} \\ L_{4,5} \end{array} \right), \ H_{2,5}^{d}, \ H_{2,5}^{u} \ .$$



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(Standard-model charged) particle content of 
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perturbative operators at dimension-four  $\supset$  up-type Yukawa couplings



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perturbative operators at dimension-four  $\supset$  up-type Yukawa couplings  $\Lambda^{u}_{ij}H_{u}Q^{i}U^{j}$ 



X: (smooth quotient of) "tetraquadric", hypersurface in  $\mathbb{P}_1 \times \mathbb{P}_1 \times \mathbb{P}_1 \times \mathbb{P}_1$ 

1-parameter family of polynomials:  $\psi$ 

$$p = \sum_{\text{even}} x_{\alpha}^2 y_{\beta}^2 u_{\gamma}^2 v_{\delta}^2 + \psi_0 \sum_{\text{odd}} x_{\alpha}^2 y_{\beta}^2 u_{\gamma}^2 v_{\delta}^2 \qquad \bullet \text{ one}$$
  
+ $\psi x_0 x_1 y_0 y_1 u_0 u_1 v_0 v_1 \qquad \bullet \text{ odd}$ 

$$V = \mathcal{O}_X \begin{pmatrix} L_1 & L_2 & L_3 & L_4 & L_5 \\ -1 & -1 & 0 & 1 & 1 \\ 0 & -3 & 1 & 1 & 1 \\ 0 & 2 & -1 & -1 & 0 \\ 1 & 2 & 0 & -1 & -2 \end{pmatrix}$$
(Standard-model charged) particle content of 
$$2 \begin{pmatrix} Q_2 \\ U_2 \\ E_2 \end{pmatrix}, \begin{pmatrix} Q_2 \\ U_2 \\ E_2 \end{pmatrix}, \begin{pmatrix} D_{2,4} \\ L_{2,4} \end{pmatrix}, 2 \begin{pmatrix} D_{4,5} \\ L_{4,5} \end{pmatrix}, H_{2,5}^d, H_{2,5}^u$$

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- Consistent string model: precisely the **MSSM particle content** 
  - no chiral exotica/vectorlike pairs
    - ne of many known MSSM-like models
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	Н	Q3	U3	Q1	Q2	Q3
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Reference calculation ( $\phi = \beta = \sigma = 0$ ) in red

- relatively good approximation  $\sim 25~\%$
- **only** ~ 1 min for 100,000 pts
- **closer** than the 'canonical' **unnormalised** holomorphic Yukawa couplings in <u>blue</u>
- enables exploration of moduli space

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- Non-abelian bundles/F-theory applications/constraining string models/type II string theories
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# specialising to SU(5)



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low energy gauge group  $SU(5)_{LE} = C_{E_8}(SU(5))$  or  $SU(5)_{LE} \times J$ ,  $J = C_{SU(5) \subset E_8}(G)$ 

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