

# Machine Learning-Enhanced Feasibility Studies on the Production of New Particles with Preferential Couplings to Third Generation Fermions at the LHC

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# Outline

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- Deficiencies of the SM
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## Deficiencies of the SM





## Hypothesis Testing and Significance





## The vector leptoquark $U_1$ model

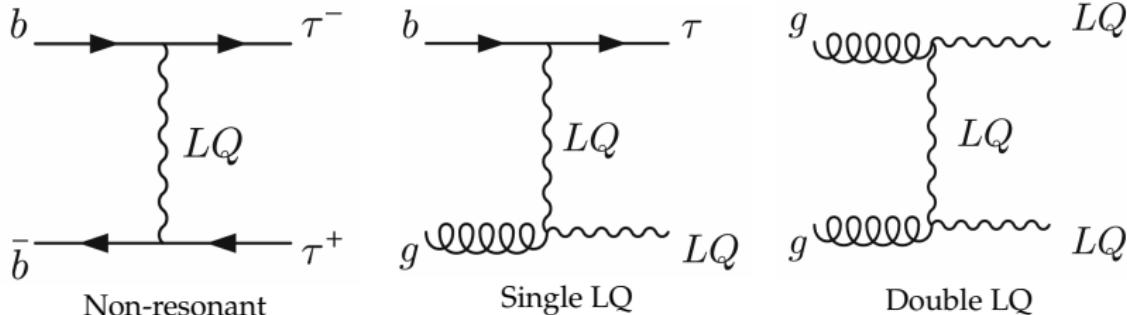
A leptoquark is defined as a particle with a vertex that mix vectors and quarks.

If  $U_1$  is a vector leptoquark that preserves the chirality on the vertex, we expect an interaction term like

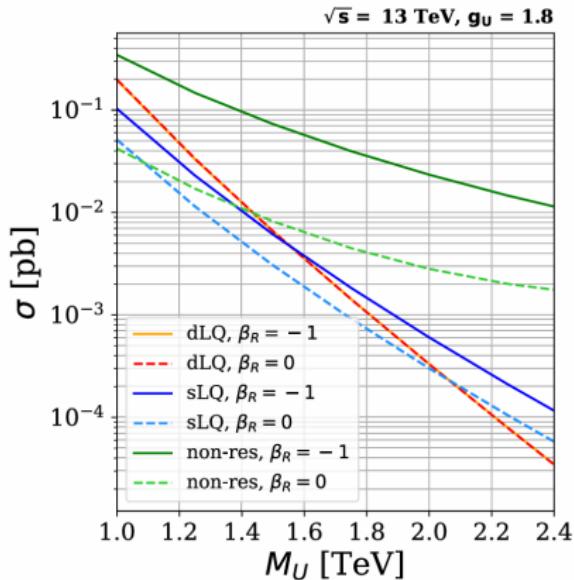
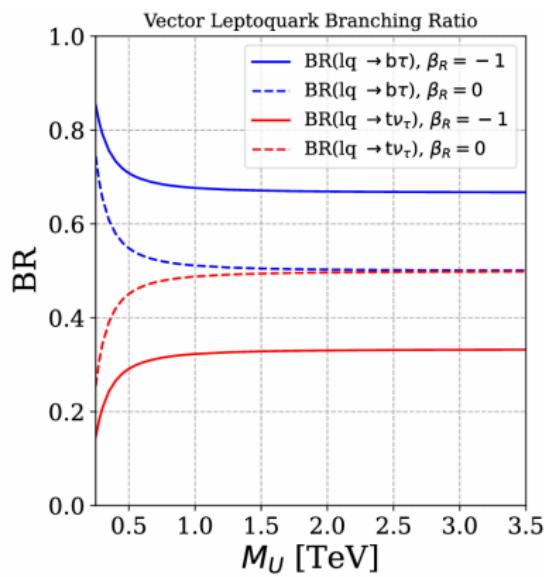
$$\sim \beta_L U_1^\mu \bar{q}_L \gamma_\mu \ell_L,$$

and these allows a similar interaction term for the right handed currents

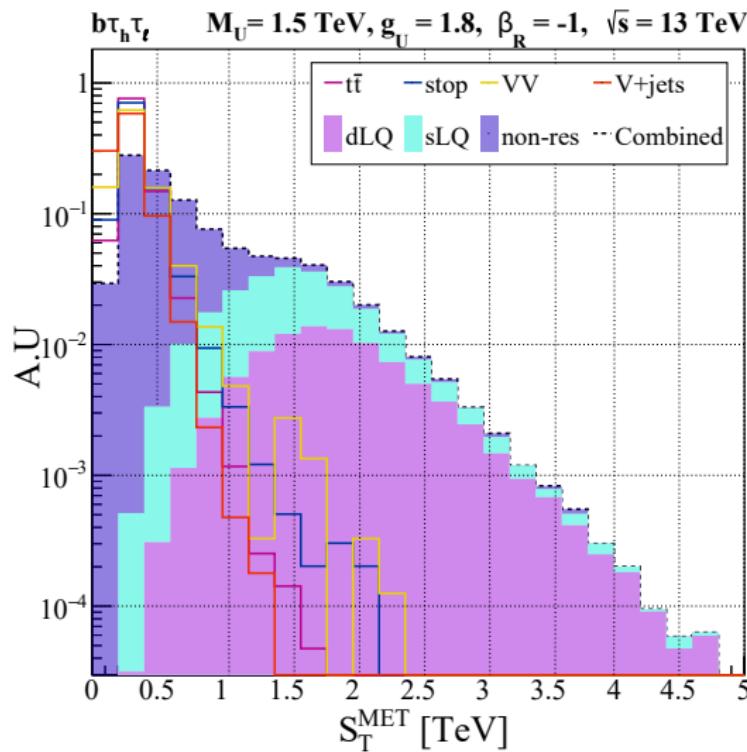
$$\sim \beta_R U_1^\mu \bar{d}_R \gamma_\mu e_R.$$



# Leptoquark Production at pp Colliders

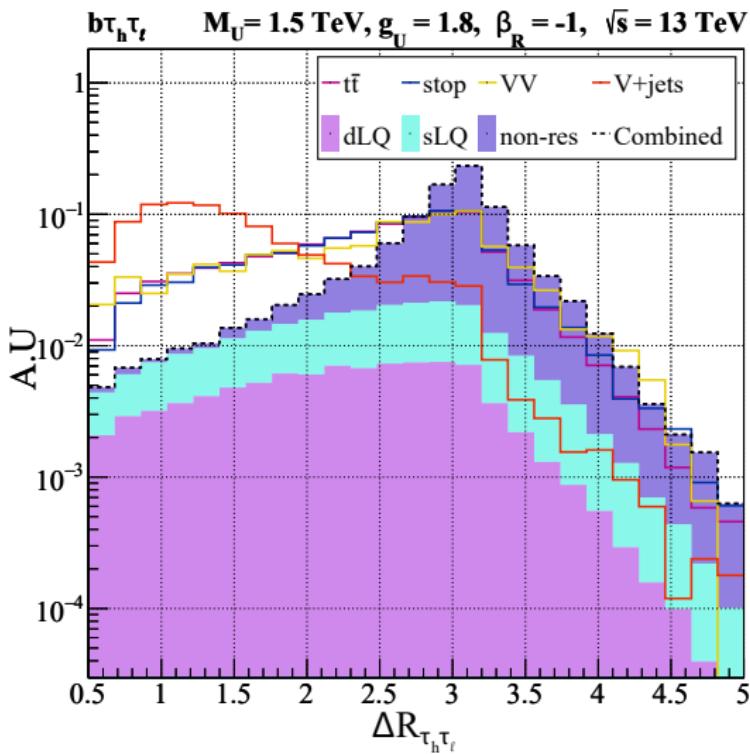


$$S_T^{\text{met}} = \text{met} + \sum_i |p_T^i|$$



## Kinematic Feature Eng.

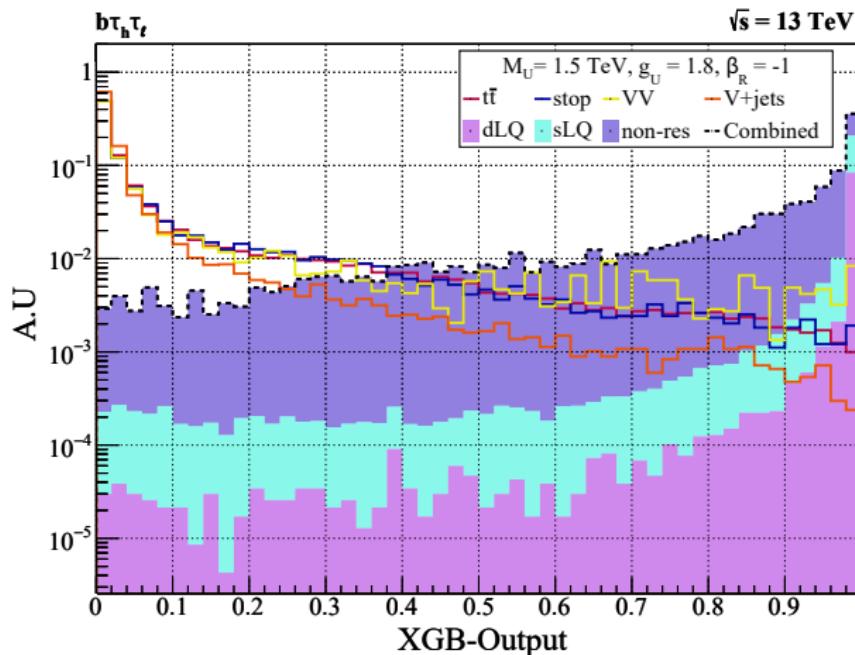
$$\Delta R = \sqrt{\Delta\eta^2 + \Delta\phi^2}$$



# The optimized observable

XGB-output

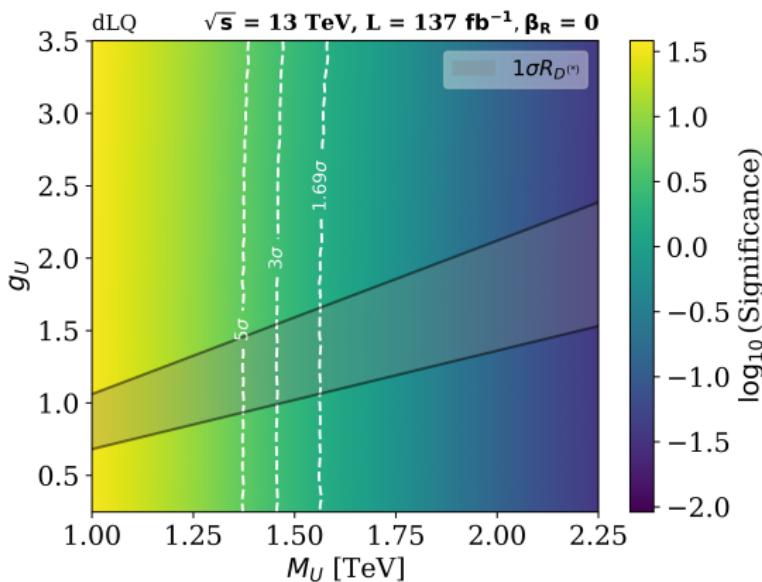
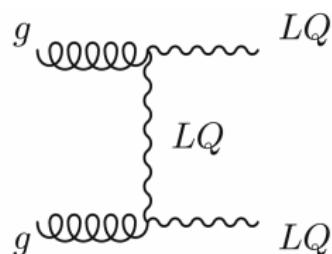
We can evaluate a score for the signal and background events using the discriminator algorithm.



Single Channels Sensitivity Reach

# Double Leptoquark Production

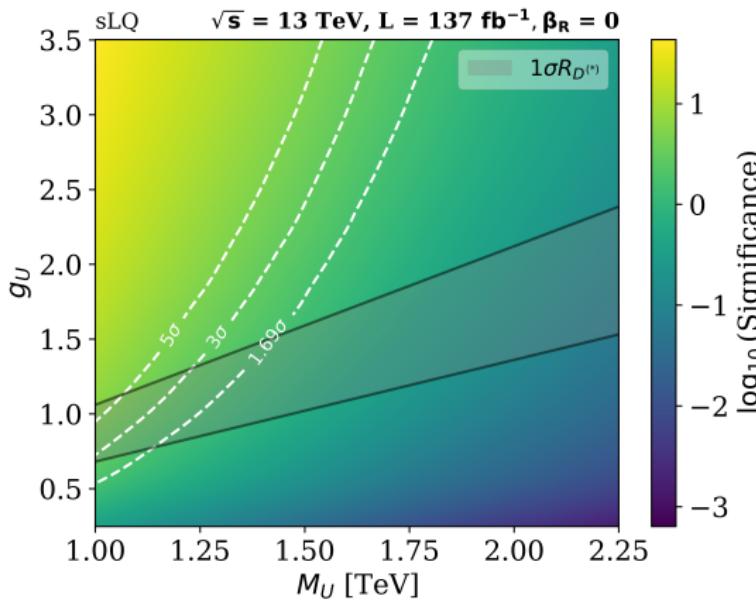
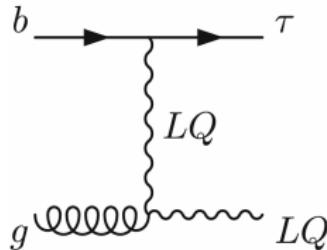
The Sensitivity Reach / only left-handed currents



Double leptoquark production is sensitive to the leptoquark mass, its production depends only on the QCD coupling constant and the available energy.

# Single leptoquark production

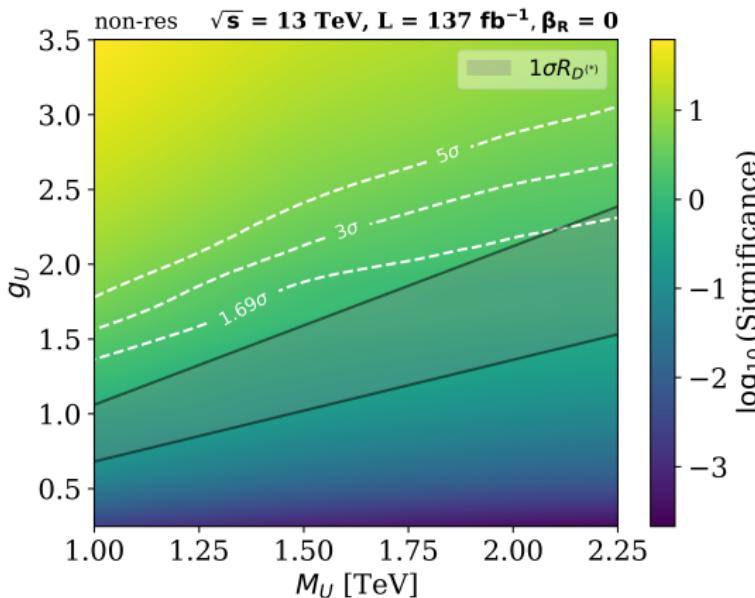
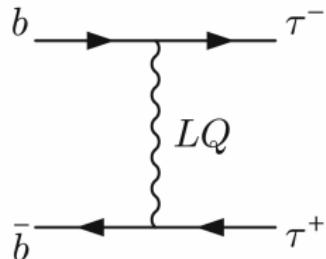
The Sensitivity Reach / only left-handed currents



Single leptoquark production is sensitive to both, mass and couplings. It contributes to the regions of high coupling constants at higher masses than double leptoquark production.

# Non-resonant Production

The Sensitivity Reach / only left-handed currents

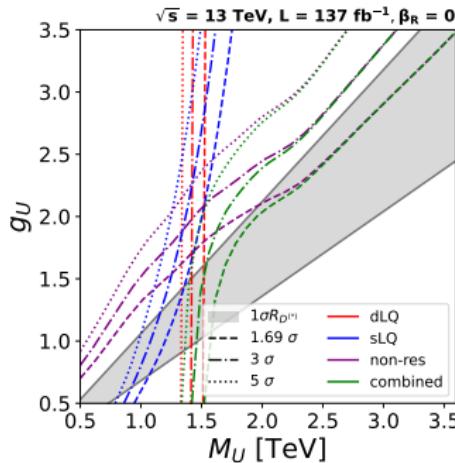
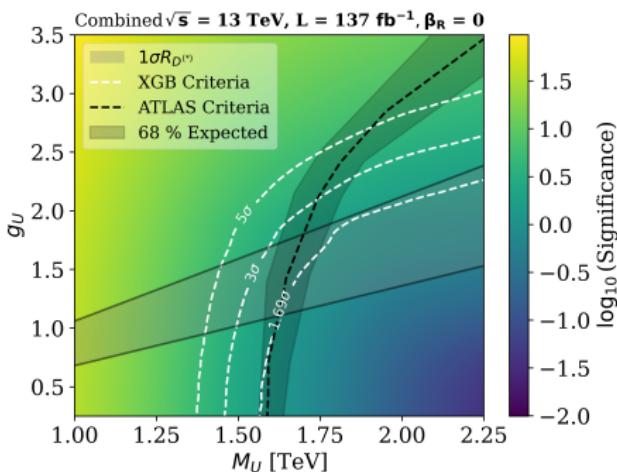


Non-resonant production is highly dependent on the couplings, so it dominates the regions of high coupling constants at all masses.

### Combined Sensitivity Reach

## Combined Sensitivity Reach

The Sensitivity Reach / only left-handed currents

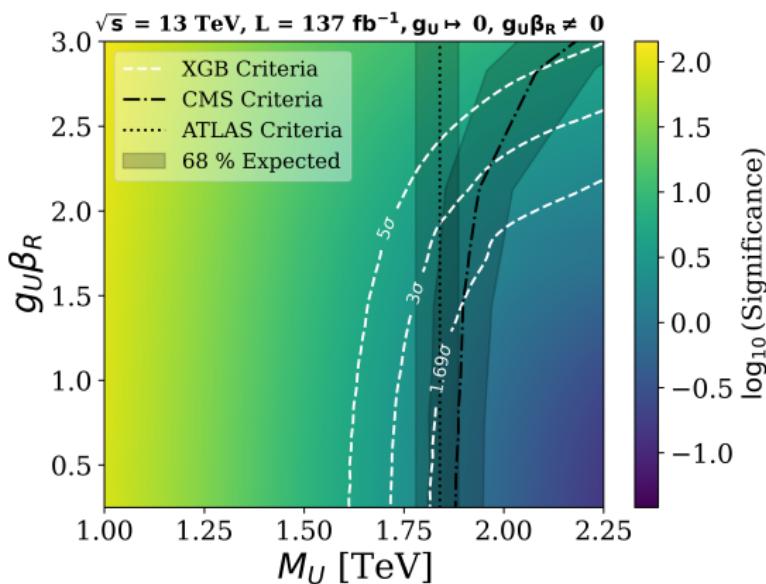


The sensitivity of all signal production processes combined compares our expected exclusion region with the latest one from the ATLAS Collaboration [ArXiv:2305.15962], but we suggest better sensitivity for high coupling constants.

## Combined Sensitivity Reach

## Combined Sensitivity Reach

The Sensitivity Reach / only right-handed currents



The case  $BR(lq \rightarrow b\tau) = 1$  corresponds to the only right-handed currents coupling. The sensitivity compared with the latest one from the CMS [2308.07826] and ATLAS Collaborations [2303.01294], again we suggest better sensitivity for high coupling constants.

## The need of a $Z'$ boson in gauge $U_1$ models

If  $U_1$  has a gauge origin, we could rewrite the interaction term in the covariant derivative as

$$\psi_L^{\text{SM}} = \begin{pmatrix} q_{Lr} \\ q_{Lg} \\ q_{Lb} \\ \ell_L \end{pmatrix} \implies \mathcal{L}_{\text{int}} \sim U_{1\alpha}^\mu \bar{\psi}_L^{\text{SM}} \gamma_\mu T_+^\alpha \psi_L^{\text{SM}} + \text{h.c.}, \quad T_+^\alpha = \begin{pmatrix} 0 & 0 & 0 & \delta_{r\alpha} \\ 0 & 0 & 0 & \delta_{g\alpha} \\ 0 & 0 & 0 & \delta_{b\alpha} \\ 0 & 0 & 0 & 0 \end{pmatrix},$$

we have six generators  $T_{\pm}^{\alpha}$  with closure relation and projecting into a color singlet operator:

$$\sum_{\alpha} [T_+^{\alpha}, T_-^{\alpha}] = 3T_{B-L} = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & -3 \end{pmatrix}.$$

So, the gauge group with this leptoquark must include a  $U(1)_{B-L}$  symmetry (The right-handed currents also have a similar interaction term).

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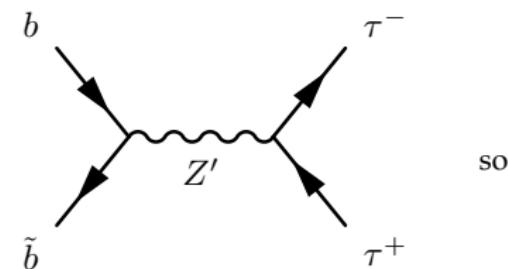
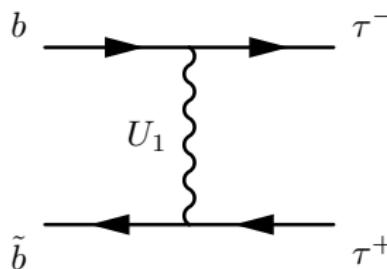
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The interaction terms for the  $Z'$  boson have the form

$$\begin{aligned}\mathcal{L}_{\text{int}} &\sim Z'_\mu \left( \bar{\psi}_L^{\text{SM}} \gamma^\mu (3T_{B-L}) \psi_L^{\text{SM}} \right) \\ &\sim Z'_\mu \left( \bar{q}_L \gamma^\mu q_L - 3 \bar{\ell}_L \gamma^\mu \ell_L \right).\end{aligned}$$

# Interference with a $Z'$ vector boson

Non-Resonant Production (leptoquarks)    Resonant Production (neutral bosons)



$$\mathcal{M}_{U_1} \sim \frac{1}{t - m_{U_1}^2 + im_{U_1}\Gamma_{U_1}}, \quad (1)$$

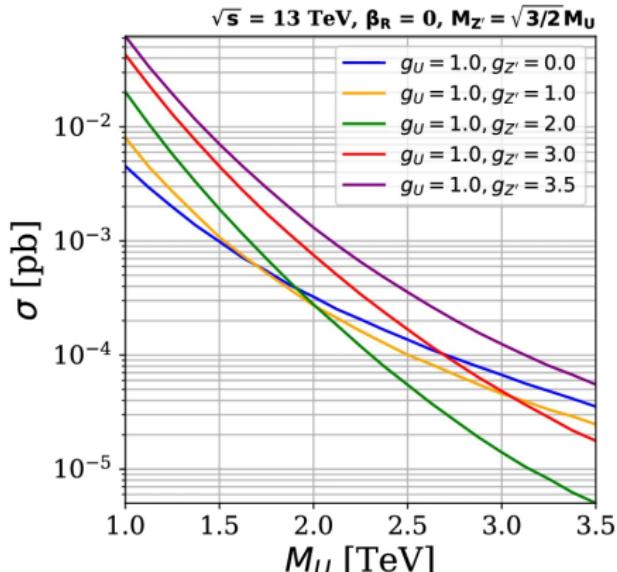
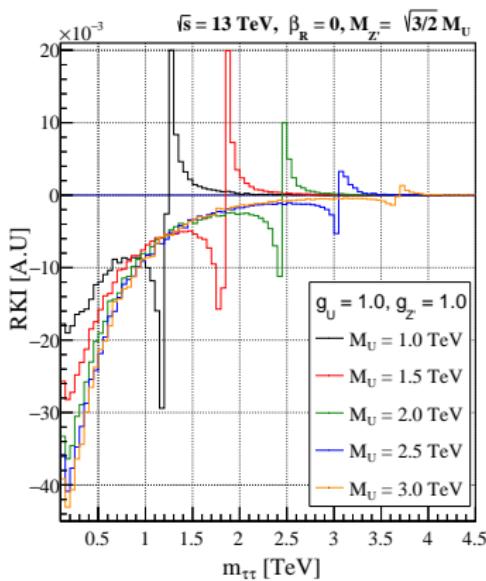
$$\mathcal{M}_{Z'} \sim \frac{1}{s - m_{Z'}^2 + im_{Z'}\Gamma_{Z'}}, \quad (2)$$

the interference has the form

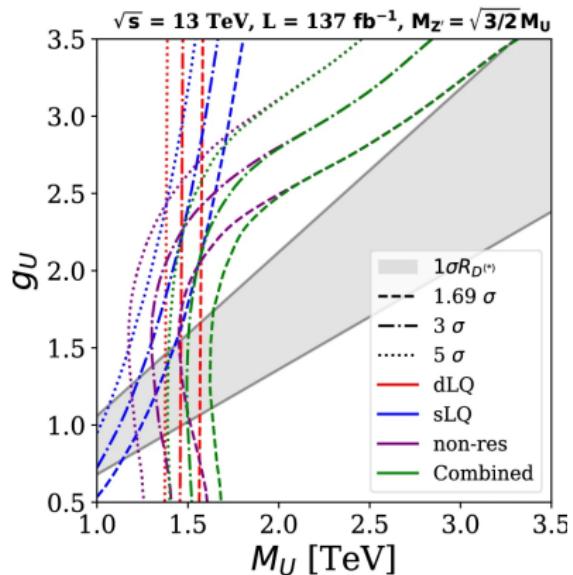
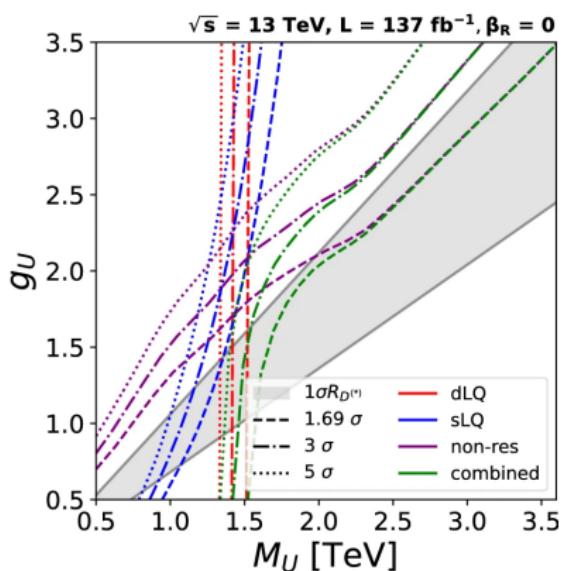
$$\frac{d}{dm} \left[ \sigma_{LQ+Z'} - \left( \sigma_{LQ} + \sigma_{Z'} \right) \right] \sim \frac{g_{z'} g_U}{s} \frac{m_{LQ} m_{Z'} \Gamma_{LQ} \Gamma_{Z'} - (t - m_{LQ}^2)(s - m_{Z'}^2)}{\left[ (t - m_{LQ}^2)^2 + m_{LQ}^2 \Gamma_{LQ}^2 \right] \left[ (s - m_{Z'}^2)^2 + m_{Z'}^2 \Gamma_{Z'}^2 \right]}.$$

Similary for Polarized final states.

## Interference with a $Z'$ vector boson



## Effects on the Sensitivity reach





Where the SM charges for the leptoquark, in the  $Y = 2(Q - T_3)$  convention, are

	$\bar{q}_L$	$\ell_L^j$	$\bar{q}_L \gamma_\mu \ell_L$	$U_1^\mu$
$U(1)$	$-1/3$	$-1$	$-4/3$	$+4/3$
$SU(2)$	$\bar{\mathbf{2}}$	$\mathbf{2}$	$\mathbf{1}$	$\mathbf{1}$
$SU(3)$	$\bar{\mathbf{3}}$	$\mathbf{1}$	$\mathbf{3}$	$\mathbf{3}$

Then, the leptoquark  $U_1 \sim (\mathbf{3}_C, \mathbf{1}_I, 4/3_Y)$ .

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The full Lagrangian for the vector leptoquark is

$$\begin{aligned} \mathcal{L}_U = & -\frac{1}{2} U_{\mu\nu}^\dagger U^{\mu\nu} + M_U^2 U_\mu^\dagger U^\mu - i g_s U_\mu^\dagger T^a U_\nu G_a^{\mu\nu} - \frac{2i}{3} g' U_\mu^\dagger U_\nu B^{\mu\nu} \\ & + \frac{g_u}{\sqrt{2}} \left[ U_1^\mu \left( \beta_L^{ij} \bar{q}_L^i \gamma_\mu e_L^j + \beta_R^{ij} \bar{d}_R^i \gamma_\mu e_R^j \right) + \text{h.c.} \right] \end{aligned}$$

where  $U_{\mu\nu} = \mathcal{D}_\mu U_\nu - \mathcal{D}_\nu U_\mu$ ,  $\mathcal{D}_\mu = \partial_\mu - i g_s G_\mu^a T^a - i \frac{2}{3} g_Y B_\mu$ , and the couplings  $\beta_L$  and  $\beta_R$  are complex  $3 \times 3$  matrices in flavor space.

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Constraints from  $\Delta F = 2$  and lepton flavor violation impose a hierarchy with dominant third generation couplings:

$$|\beta_L^{11}|, |\beta_L^{12}|, |\beta_L^{21}|, |\beta_L^{22}|, |\beta_L^{31}| \ll |\beta_L^{13}| \ll |\beta_L^{23}|, |\beta_L^{32}| \ll |\beta_R^{33}|, |\beta_L^{33}| = \mathcal{O}(1), \quad (3)$$

where  $\beta_R$  is diagonal.

# Two body scattering

CM-Frame

Consider the process

$$A(\vec{p}_1) + B(\vec{p}_2) \longrightarrow C(\vec{p}_3) + D(\vec{p}_4), \quad (4)$$



From the Golden Rule, the cross section is given by

$$\sigma = \frac{n!(2\pi)^4}{4\sqrt{(\vec{p}_1 \cdot \vec{p}_2)^2 - (m_1 m_2)^2}} \int |\mathcal{M}|^2 \delta^{(4)}(p_1 + p_2 - p_3 - p_4) \frac{d^3 \vec{p}_3}{(2\pi)^3 2E_3} \frac{d^3 \vec{p}_4}{(2\pi)^3 2E_4}. \quad (5)$$

But, in the CM frame,  $\vec{p}_1 + \vec{p}_2 = 0$ , where

$$\sqrt{(\vec{p}_1 \cdot \vec{p}_2)^2 - (m_1 m_2)^2} = E_1 E_2 |\vec{p}_1|, \quad (6)$$

$$\delta^{(4)}(p_1 + p_2 - p_3 - p_4) = \delta(E_1 + E_2 - E_3 - E_4) \delta^{(3)}(\vec{p}_3 + \vec{p}_4). \quad (7)$$

Thus

$$\sigma = \left(\frac{1}{8\pi}\right)^2 \frac{n!}{(E_1 E_2) |\vec{p}_1|} \int |\mathcal{M}|^2 \frac{\delta(E_1 + E_2 - \sqrt{\vec{p}_3^2 + m_3^2} - \sqrt{\vec{p}_4^2 + m_4^2})}{\sqrt{\vec{p}_3^2 + m_3^2} \sqrt{\vec{p}_4^2 + m_4^2}} d\vec{p}_3 \quad (8)$$

Integrating over the radial part  $|\vec{p}_3|$ , we get

$$\sigma = \left(\frac{1}{8\pi}\right)^2 \frac{n! |\vec{p}_3|}{(E_1 + E_2)^2 |\vec{p}_1|} \int |\mathcal{M}|^2 d\Omega, \quad (9)$$

with

$$|\vec{p}_3| = \frac{1}{2} \frac{\sqrt{((E_1 + E_2)^2 - m_3^2 - m_4^2)^2 - 4m_3^2 m_4^2}}{E_1 + E_2}, \quad (10)$$

the outgoing momentum in the CM frame.

We prefer work with differential cross section as

$$\frac{d\sigma}{d\Omega} = \frac{1}{64\pi^2} \frac{n!}{(E_1 + E_2)^2} \frac{|\vec{p}_3|}{|\vec{p}_1|} |\mathcal{M}|^2. \quad (11)$$

Defining  $\sqrt{s} = E_1 + E_2$ , we have

$$|\vec{p}_3| = \frac{1}{2} \frac{\sqrt{(s - m_3^2 - m_4^2)^2 - 4m_3^2 m_4^2}}{\sqrt{s}}, \quad |\vec{p}_1| = \frac{1}{2} \frac{\sqrt{(s - m_1^2 - m_2^2)^2 - 4m_1^2 m_2^2}}{\sqrt{s}}. \quad (12)$$

so the differential cross section is

$$\frac{d\sigma}{d\Omega} = \frac{1}{64\pi^2} \frac{n!}{s} \sqrt{\frac{(s - (m_3 + m_4)^2)(s - (m_3 - m_4)^2)}{(s - (m_1 + m_2)^2)(s - (m_1 - m_2)^2)}} |\mathcal{M}|^2. \quad (13)$$

Note that at this point, we don't need to know the explicit form of the matrix element  $\mathcal{M}$ , so it is a generic result.

## Writting $t$ in terms of $s$ and $\theta$

In general, there are three Lorentz-invariant useful kinematical variables to describe the scattering process, known as Mandelstam variables:

$$\hat{s} = (p_1 + p_2)^2 = (p_3 + p_4)^2 = m_1^2 + m_2^2 + 2p_1^\mu p_{2\mu} = m_3^2 + m_4^2 + 2p_3^\mu p_{4\mu}, \quad (14)$$

$$\hat{t} = (p_1 - p_3)^2 = (p_2 - p_4)^2 = m_1^2 + m_3^2 - 2p_1^\mu p_{3\mu} = m_2^2 + m_4^2 - 2p_2^\mu p_{4\mu}, \quad (15)$$

$$\hat{u} = (p_1 - p_4)^2 = (p_2 - p_3)^2 = m_1^2 + m_4^2 - 2p_1^\mu p_{4\mu} = m_2^2 + m_3^2 - 2p_2^\mu p_{3\mu}. \quad (16)$$

In the CM-frame,  $\hat{s} = s = (E_1 + E_2)^2$ . If,  $m_3 = m_4$  and  $m_1 = m_2$  with  $E_1 = E_2 = E_3 = E_4 = E$ , we have

$$t = -(\vec{p}_1 - \vec{p}_3)^2 = -\vec{p}_1^2 - \vec{p}_3^2 + 2\vec{p}_1 \cdot \vec{p}_3 \quad (17)$$

where  $\vec{p}_1^2 = E^2 - m_1^2$  and  $\vec{p}_3^2 = E^2 - m_3^2$ .

So, in terms of  $s$ ,  $t$  could be written as

$$t = -2s + (m_1^2 + m_3^2) + 2\sqrt{(s/4 - m_1^2)(s/4 - m_3^2)} \cos \theta, \quad (18)$$

with  $\theta$  the scattering angle in the CM-frame.