

# Illuminating all-hadronic final states with a photon: Exotic decays of the Higgs boson to four bottom quarks in vector boson fusion plus gamma at hadron colliders

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We investigate the potential to detect Higgs boson decays to four bottom quarks through a pair of pseudoscalars, a final state that is predicted by many theories beyond the Standard Model. For the first time, the signal sensitivity is evaluated for the final state using the vector boson fusion (VBF) production with and without an associated photon, for the Higgs at  $m_H = 125$  GeV, at hadron colliders. The signal significance is  $0.5\sigma$  to  $6\sigma$ , depending on the pseudoscalar mass  $m_a$ , when setting the Higgs decay branching ratio to unity, using an integrated luminosity of  $150 \text{ fb}^{-1}$  at  $\sqrt{s} = 13$  TeV. This corresponds to an upper limit of 0.3, on the Higgs branching ratio to four bottom quarks, with a nonobservation of the decay. We also consider several variations of selection requirements—input variables for the VBF tagging and the kinematic variables for the photon—that could help guide the design of new triggers for the Run-3 period of the LHC and for the HL-LHC.

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## I. INTRODUCTION

After the discovery of the Higgs boson at  $m_H = 125$  GeV by the ATLAS and CMS Collaborations in 2012 [1,2], the question of whether the observed particle shows any deviation from the Standard Model (SM) has been vigorously pursued. So far, the experimental observation of several decay and production properties have confirmed the hierarchy of Yukawa couplings [3–11] and further studies of the  $CP$  properties are consistent with the SM [12–17]. The combined fits of these individual measurements constrain the decay width of the Higgs boson and put a constraint on the undetected non-SM fraction of all decays to be less than 0.12 (ATLAS [18]) or 0.16 (CMS [19]). These constraints do not include the undetectable decays as inputs to the combination. However, these fits make assumptions, such as the range of allowed couplings to vector bosons, that may not be involved in searches for

specific final states predicted by theories beyond the Standard Model (BSM). Therefore, direct searches, such as those proposed in this paper, provide complementary information.

Due to the relatively narrow width of the SM Higgs boson  $\Gamma_H \approx 4$  MeV [20], a small coupling to a new light state could lead to a branching ratio that is large enough to be observed at the Large Hadron Collider (LHC) while still evading current experimental constraints. A wide range of models in which the Higgs boson decays ‘exotically’ to light scalars or pseudoscalars have been proposed [21–29]. In these models, such a particle is called  $a$  and typically decays to SM particles. Following the Yukawa ordered coupling patterns of the Higgs boson, the branching ratio of  $a$  to fermions scales with the mass of the fermion, so the decay  $a \rightarrow b\bar{b}$  is the largest. For the kinematically accessible cases, the Higgs boson decays into two  $a$  particles leading to the overall final state of  $H \rightarrow aa \rightarrow b\bar{b}b\bar{b}$ , which we write as  $H_{4b}$ . We consider the models in which the  $a$  pseudoscalar decays promptly. In other models not examined in this paper, the  $a$  particle can have a significant lifetime (see Ref. [30] for a recent review).

However, such exotic decays of the Higgs boson [30] present an experimental challenge at the LHC, as all-hadronic final states are often difficult to separate from the large background rate from QCD production of multiple hadronic jets (multijet). A variety of proposals exist to trigger on the lepton from the  $W$  or  $Z$  decay in the

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associated production of the Higgs boson for  $H_{4b}$  [26,27,31], on  $b$  physics triggers for  $H_{4b}$  at LHCb [32], and on the vector boson fusion (VBF) production mode for  $H \rightarrow aa \rightarrow b\bar{b}\tau\tau$  [23,33–35]. The VBF production mode in particular has been shown to be of importance for  $a$  particles with significant lifetime [36]. For prompt signatures, VBF has been proposed for the  $H \rightarrow 4\tau$  [37] and  $H \rightarrow \gamma\gamma jj$  [38] final states, the latter of which inspired an ATLAS search for  $H \rightarrow \gamma\gamma jj$  final state [39].

The ATLAS search using the  $W$  or  $Z$  associated production channel resulted in an upper limit on the branching ratio of  $\mathcal{B}(H_{4b})$  for  $m_a = 60$  GeV at approximately 0.6 with an expected value of 0.4 at 95% confidence level [40,41]. No searches have yet been attempted for  $H_{4b}$  in the VBF production channel, the topic of this paper, although promising searches for di-Higgs,  $HH \rightarrow 4b$ , exist [42].

Additional searches for exotic Higgs decays with cleaner final states, such as  $H \rightarrow aa \rightarrow b\bar{b}\mu\mu$  allow for improved sensitivity [43–45]. However, some models—such as type-I two-Higgs doublet models called 2HDMs—prefer final states with  $b$  quarks with relatively low branching ratios to muons [46], so  $H_{4b}$  remains an important benchmark at the LHC. The model-specific branching ratio to the  $4b$  final state is the product of the branching ratio of Higgs to  $aa$  and  $a \rightarrow b\bar{b}$ ,  $\mathcal{B}(H \rightarrow aa) \cdot \mathcal{B}(a \rightarrow b\bar{b})^2$ . To simplify the presentation and for comparison with existing literature, we present results assuming  $\mathcal{B}(H_{4b}) = 1$ .

Beyond the LHC,  $H_{4b}$  is often suggested as a benchmark for searches at future colliders, such as the ILC [47], a proposed electron-positron collider, and the LHeC [48,49], an upgrade to the LHC to allow for  $ep$  collisions. A future electron-positron collider provides the cleanest final state and the strongest constraint, with a sensitivity of  $\mathcal{B}(H_{4b})$  as low as  $3 \times 10^{-4}$  [50,51]. It is also reported in Ref. [50] that the high luminosity LHC (HL-LHC) will probe  $\mathcal{B}(H_{4b})$  to around 0.2. Given the importance of  $H_{4b}$  as a benchmark, the LHC experiments should consider various methods to target this final state during Run-3 as well as later at the HL-LHC. In particular, trigger strategies should be considered that maximize the potential of this channel.

As the LHC experiments have explored  $W$  or  $Z$  associated Higgs production, we investigate the potential of the hadronic VBF final state, with and without a photon. As previously mentioned, the multijet background is expected to dominate the VBF signal for  $H_{4b}$ . One proposed handle for the background is to require a photon produced in association with the VBF Higgs production [52–55]. Figure 1 shows a Feynman diagram of the VBF signal production channel without a photon (VBF $_{0\gamma}$ ) and with a photon (VBF $_{1\gamma}$ ). In addition to reducing the background, the photon also provides a handle for implementing a more efficient level-1 (L1) trigger, increasing the overall acceptance for the final

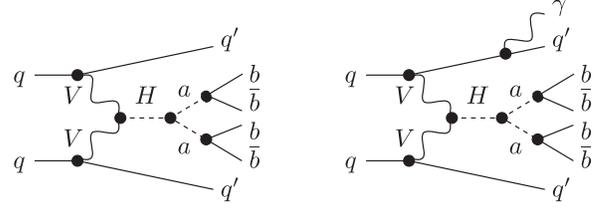


FIG. 1. VBF production channel without a photon (left) and with a photon (right) followed by the Higgs decay. In both cases, the Higgs boson decays to two pseudoscalars to four bottom quarks. Representative Feynman diagrams are shown and that the photon on the right can radiate from any of the charged particles, including from the vector bosons.

state. The ATLAS experiment, for example, has already successfully utilized the photon in the VBF production channel in the search for the SM decay  $H \rightarrow b\bar{b}$  [56,57] and the search for the BSM-enhanced invisible  $H$  decay [58]. We show later that a similar photon strategy would be beneficial for targeting  $H_{4b}$ , and all production modes taken together will lead to a comprehensive search strategy, such as utilized in other exotic decays like Higgs to invisible [59,60].

The relatively recent development of implementing machine learning (ML) methods for classification and regression, such as hls4ml’s implementation of neural networks [61–64] and boosted decision trees (BDT) by hls4ml/conifer [65] and FWXMACHINA [66,67], on custom electronics boards with field programmable gate arrays (FPGA) has opened up a new era of possibility for ML-based L1 triggers. These tools have demonstrated the ability to perform ML classification of VBF production based on jets within 20 ns [66], which is well below the latency and resource constraints of L1 triggers at the LHC experiments [68,69]. Therefore, we assume that the BDT taggers proposed in this paper are implementable at L1 using the above-mentioned tools.

In this paper, we present the first detailed estimate of the sensitivity of  $H_{4b}$  using a BDT-based VBF tagger that could be implemented at the ATLAS or CMS L1 trigger. We also compare the  $H_{4b}$  sensitivity of the BDT-based tagger to cut-based triggers inspired by triggers already implemented by the ATLAS and CMS experiments [69–73].

The paper is organized as follows. The next subsection describes the overall analysis strategy. Section II describes the data sample, the event generation and simulation as well as the detector setup and reconstruction techniques. Section III describes the data analysis, introducing a VBF tagger and Higgs taggers. Section IV presents the results, an estimate of the sensitivity for  $L = 150 \text{ fb}^{-1}$  of integrated luminosity and a projection for the HL-LHC. Various trigger scenarios and methods for improving the signal sensitivity are also discussed. Section V concludes with an outlook for future searches.

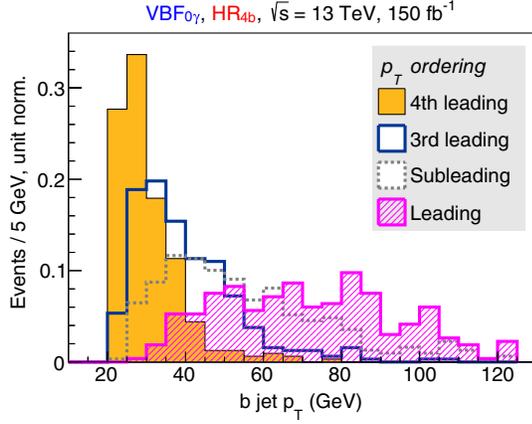


FIG. 2. The  $p_T$  distribution of each of the four  $b$  jets from the  $H_{4b}$  signal sample with  $m_a = 50$  GeV. These jets, as well as the VBF jets, are required to have  $p_T > 20$  GeV at reconstruction in DELPHES. The plots are normalized to unity.

### A. Analysis strategy

The strategy for separating signal from the SM background is as follows. First, a VBF tagger is used to target the VBF production mode of the Higgs boson. The sample is separated into two channels,  $VBF_{0\gamma}$  and  $VBF_{1\gamma}$  that contain events without and with a photon, respectively.

For the Higgs reconstruction (HR), two channels are considered corresponding to the number of reconstructed  $b$ -quark jets,  $HR_{4b}$  and  $HR_{3b}$ . The former channel has six total reconstructed jets; two from the production and four from the Higgs decay. The  $HR_{4b}$  channel has limitations, however, because the lowest- $p_T$   $b$  jet is generally below 40 GeV and may evade identification. Figure 2 shows the  $p_T$  distribution for the  $VBF_{0j}$  signal sample for  $m_a = 50$  GeV with the jet requirement of  $p_T > 20$  GeV. This selection requirement leads to a large fraction of events with only three reconstructed jets from the  $H_{4b}$  decay. The latter  $3b$  channel catches scenarios in which one of the  $H_{4b}$  jets is not reconstructed. The loss of a jet can occur either due to merging with a nearby jet or if the jet fails one of the reconstruction requirements, which can cause it to fail the  $b$ -tagging selection, or a combination of both. Examining

TABLE I. The four analysis channels considered in this study.  $O_{\text{VBF}}$  represents the VBF tagger.  $O_{4b/3b}^{m_a}$  represents the Higgs taggers for the  $4b$  and  $3b$  Higgs reconstruction (HR) channels, respectively, for a given  $m_a$ . Different values of  $m_a$  change the kinematic distributions of the final state, thus require different BDT.

Reconstruction	Production	
	$VBF_{0\gamma}$	$VBF_{1\gamma}$ channel
$HR_{4b}$ channel	$O_{4b}^{m_a}, O_{\text{VBF}}$	$O_{4b}^{m_a}, O_{\text{VBF}}, \text{req. } \gamma$
$HR_{3b}$ channel	$O_{3b}^{m_a}, O_{\text{VBF}}$	$O_{3b}^{m_a}, O_{\text{VBF}}, \text{req. } \gamma$

the signal for  $m_a = 35$  GeV, approximately 20% of events had three  $b$ -flavored jets, while only approximately 3% had four  $b$ -flavored jets. The fraction is lower for the  $m_a = 10$  GeV sample, for which 1.5% of events had three  $b$ -flavored jets and 0.1% of events had four  $b$ -flavored jets. Therefore, we consider  $HR_{3b}$  in which there are five total reconstructed jets. A dedicated BDT-based tagger is used for each HR.

The combinations of the Higgs production and decay reconstruction gives rise to four analysis channels, which are given in Table I. All taggers are described later in Sec. III.

## II. SIMULATED DATA SAMPLES

Approximately 1.5 billion events are generated for this study using Monte Carlo simulation. The event simulation (Sec. II A) is described followed by the event reconstruction (Sec. II B). A subsample of about 150 million events—those that pass a loose set of requirements on the number of reconstructed jets specified in Sec. II B—can be found online [74].

The data sample collected during in the Run-3 data taking period is expected to be around  $150 \text{ fb}^{-1}$  [75]. Our main study (Sec. IV A) is optimized for this integrated luminosity. The study is extended to HL-LHC (Sec. IV C) by scaling the luminosity to  $3 \text{ ab}^{-1}$ .

### A. Event simulation

The signal and background samples considered are listed in Table II. All samples are generated at leading order (LO) with `MadGraph5 v2.7.3` [76] with the Standard Model configuration. The generated event is then passed to `PYTHIA v8.306` for the parton shower and hadronization process [77,78] using the ATLAS AZ Tune 17 [79]. All events are generated with a proton-proton center-of-mass energy of  $\sqrt{s} = 13$  TeV, which was the value for Run-2 operations. For the Run-3 operations that started in 2022, the LHC increased the center-of-mass energy to 13.6 TeV. A previous scaling study [55] demonstrated a linear increase in cross section from  $\sqrt{s}$  from 13 TeV to 13.6 TeV, and therefore this percent-level difference is not considered here.

The background processes are weighted according to the cross sections stated in Table II. These cross sections are calculated by `MadGraph5` at leading order during sample generation. Notationally, final states such as  $b\bar{b} + jj$  involve requirements on the parton selections passed to `MadGraph`, which in this case correspond to two  $b$ -quark jets and two light-flavor jets  $j$ . The latter refers to gluons as well as quarks with a smaller mass than the bottom quark. For each sample, the following requirements are applied. Hadronic jets were produced with a minimum  $p_T$  of 20 GeV and an angular separation  $\Delta R > 0.4$  between every jet, where  $\Delta R = \sqrt{\Delta\phi^2 + \Delta y^2}$  is the distance in azimuthal angle  $\phi$  and rapidity  $y$ . Photons are required to

TABLE II. List of samples used and the corresponding cross sections. The  $j$  refers to light-flavor hadronic jets.

Sample	Cross section [pb]
Signal, $m_H = 125$ GeV	
VBF $_{0\gamma}$ production channel	3.8 [80]
VBF $_{1\gamma}$ production channel	$9.45 \times 10^{-2}$ [58]
Background for VBF $_{0\gamma}$	
$b\bar{b}$	$2.83 \times 10^6$
$b\bar{b} + j$	$9.86 \times 10^5$
$b\bar{b} + jj$	$5.04 \times 10^5$
$b\bar{b} + b\bar{b}$	1541
$t\bar{t}$	505
$Z_{bb} + b\bar{b}$	10.4
Background for VBF $_{1\gamma}$	
$b\bar{b} + \gamma$	738
$b\bar{b} + j + \gamma$	732
$b\bar{b} + jj + \gamma$	433
$t\bar{t} + \gamma$	2.1
$Z_{bb} + jj + \gamma$	1.8
$Z_{bb} + b\bar{b} + \gamma$	$1.6 \times 10^{-2}$

have a minimum  $p_T > 10$  GeV and a maximum pseudorapidity  $|\eta| < 2.5$ . Photons are also required to be separated from any hadronic jets by  $\Delta R > 0.4$  at the generator level.

The signal samples are produced with the Higgs mass of 125 GeV for the two production channels, VBF $_{0\gamma}$  and VBF $_{1\gamma}$ . The same jet and photon selections at generator level, as described for the background processes, are applied. The cross section of VBF $_{0\gamma}$  is normalized to the prediction from the LHC Higgs Working Group [80], computed at next-to-next-to-leading-order (NNLO) in QCD using proVBF [81] and includes corrections at next-to-leading-order (NLO) from electroweak and photon processes computed using HAWK [82]. The cross section of VBF $_{1\gamma}$  is taken from the Auxiliary Material of Ref. [58], computed at NLO using MadGraph5\_aMC@NLO v2.6.2 with the parton shower computed using HERWIG v7.1.3p1 [83,84]. There is no explicit photon veto for VBF $_{0\gamma}$  and there is no overlap with VBF $_{1\gamma}$  at the event generation level. We verified that approximately 1% of VBF $_{0\gamma}$  events contain a photon after showering and reconstruction.

After the Higgs production, the Higgs boson is decayed to  $H_{4b}$  using PYTHIA v8.306 without any generator-level cuts. Four separate decays are considered corresponding to pseudoscalar masses  $m_a = 10$  GeV, 25 GeV, 35 GeV, and 50 GeV. In summary, four signal samples are made for the combination of the two production and four decay processes.

Ideally, processes with six or more partons would be simulated with many of these partons being  $b$  quarks. However, it is computationally expensive to simulate such events with high parton multiplicity. In MadGraph each

additional parton increases the simulation time by approximately an order of magnitude. For instance, the simulation time for events with more than four partons is  $\mathcal{O}(1)$  hour [85]. Therefore, it is not practical to generate some potentially relevant background samples such as  $b\bar{b}b\bar{b} + jj + \gamma$  with a statistically robust sample size. Our solution to address the sample statistics is twofold. First, we truncate the number of partons required in the MadGraph generation at four total jets at the generator level, such as  $b\bar{b} + jj$ , for the background processes and rely on PYTHIA to produce additional jets via parton shower. Second, we weight the events by the product of  $b$ -tagging probabilities for the non-VBF jets.

At this point, we introduce some notation to ease our discussion. The two jets with the highest invariant mass [56] are denoted as the ‘VBF jet pair’ and are labeled with uppercase letters  $JJ$ . Individually, they are distinguished as  $J_1$  and  $J_2$ , with the ordering to denote the leading and subleading  $p_T$  jet, respectively. To validate this decision, a sample of 100k VBF $_{0\gamma}$  signal events are investigated. In only 8% of those events, one or both of the jets in the pair with the highest invariant mass included a  $b$  quark and therefore arise from the Higgs decay rather than the VBF process. We conclude that for the signal process, choosing the jet pair with the highest invariant mass correctly selects those arising from VBF production in 92% of events.

The remaining jets, four of them for HR $_{4b}$  and three of them for HR $_{3b}$ , are candidate  $b$  quarks with subscripts labeled according to their large-to-small sorted  $p_T$  values as  $b_1, b_2, b_3$ , and  $b_4$ , with the last jet only considered for HR $_{4b}$ .

In the generation of background processes, we limit MadGraph at four jets with additional parton shower jets from PYTHIA. After identifying the VBF jets  $JJ$ , the remaining  $b_i$  jets are considered for their  $b$ -tagging probability,  $\epsilon_b$ . Instead of requiring that the remaining jets be  $b$ -tagged, we consider the product of their  $b$ -tagging probability as the event weight [86,87] using the  $\epsilon_b$  function of the CMS Delphes card, derived from Ref. [88].

We validated our twofold approach as follows. The truncation is validated using three samples—corresponding to  $b\bar{b} + j$ ,  $b\bar{b} + jj$ , and  $b\bar{b} + 3j$  at parton level—of around 100k events each. As described above, any additional jets in the sample are acquired from the parton shower in PYTHIA. Using the  $b$  event weight described above, we compare the number of events from each sample with four reconstructed  $b$  jets. The difference with respect to the prediction for the number of events is found to be within 10%.

The  $b$ -event weight method is validated in a simulated multijet sample by comparing the number of events with four  $b$  tags to the expected number from the weighting scheme. The difference is found to be within 1%.

## B. Event reconstruction

The detector simulation is performed using DELPHES3.5 and object reconstruction is done using DELPHES-based

algorithms [89,90]. Detector parameters are selected to match the CMS detector as implemented using the CMS card without pileup.

Hadronic jets with a  $p_T$  of at least 20 GeV are reconstructed with the `FastJet` program [91] using the anti- $k_r$  algorithm with a radius parameter of 0.4 [92]. In order to ensure that the CMS card is appropriately reconstructing jets, the  $p_T$  resolution is evaluated using QCD multijet events and reconstructing generator-level anti- $k_r$  jets with the same parameters. If the nearest generator-level jet is within  $\Delta R \leq 0.3$  of the reconstructed jet, then it is assumed that the matching reconstructed jet came from that generator-level jet. The jet energy resolution is found to be approximately 10%, consistent with the values reported by ATLAS [93] and CMS [94].

The identification of jets containing  $b$  hadrons ( $b$  tagging) is performed by first identifying the flavor of the parton in the jet, then assigning the corresponding efficiency using the values given in Ref. [88]. The  $b$ -tagging efficiency,  $\epsilon_b$ , is a function of jet flavor and jet  $p_T$  [95].

The tagging efficiency expression reduces to a maximum efficiency of 70% for jets with a bottom quark, 20% for jets with a charm quark and 1% for light-flavor jets. Improvements in  $b$  tagging, such as those from ML-based algorithms are not included here [96,97].

Photon candidates are reconstructed with a minimum  $p_T$  of 10 GeV and  $|\eta| < 2.5$ . Each photon is weighted using an efficiency factor that depends on its  $p_T$  and  $\eta$  [98].

### III. DATA ANALYSIS

The analysis of the MC samples described in the previous section consists of three parts. The trigger assumptions are stated (Sec. III A) and target only the VBF jets. The VBF production of the Higgs boson, with and without a photon, is selected using a single VBF tagger (Sec. III B) independent of the Higgs decay. The  $H_{4b}$  decay is selected for the two reconstruction channels using Higgs taggers (Sec. III C) independent of the VBF production.

#### A. Trigger

Multipurpose experiments, such as ATLAS [99,100] and CMS [101], utilize two-level trigger systems. The first-level L1 trigger evaluates algorithms within a few microseconds in hardware [68,69,102], while the second high-level trigger (HLT) evaluates algorithms in software [103] in  $\mathcal{O}(1)$  second. In the current configuration of ATLAS and CMS, the L1 trigger system is limited in information and primarily utilizes only information from the muon and calorimeter subdetectors.

For the HL-LHC data-taking, CMS plans to incorporate tracking into L1 [104]. ATLAS upgrades are also planned [105,106] to expand the capabilities of the calorimeter reconstruction for L1. While these upgrades will undoubtedly improve the general capabilities of the trigger

system, we focus on variations that are similar to the current trigger capabilities available in Run 2 and Run 3.

The trigger strategy followed in this paper, as well as the current stated strategy of ATLAS and CMS, is to use only the VBF jets. The VBF jets are generally higher in  $p_T$  compared to the  $b_i$  jets from the Higgs decay as was discussed in Sec. II A. Therefore, the Higgs decay products or the Higgs taggers are not considered for triggering.

The VBF tagger presented here makes favorable trigger assumptions, such as the presence of all reconstructed hadronic jets with the reconstruction thresholds  $p_T > 20$  GeV as inputs to  $\mathcal{O}_{\text{VBF}}$ . In Sec. IV B, we compare our BDT method to VBF taggers using various cut-based approaches for the trigger that drop some of these assumptions.

#### B. VBF tagger

Hadronic jets arising from VBF Higgs production have a distinct kinematic signature. This signature includes a high dijet invariant mass, a large difference in  $\eta$  between the jets, and a small separation in  $\phi$  relative to the QCD multijet background. Using the pair of VBF jets  $JJ$  defined in the previous section, we develop a BDT-based VBF tagger using  $J_1$  and  $J_2$ .

TMVA [107] is used to train a forest of 200 decision trees at a maximum depth of 6 using the adaptive boost algorithm [108]. The input variables to the BDT, listed below, are based on the two VBF jets  $J_1$  and  $J_2$ .

- (i)  $m_{JJ}$ , dijet invariant mass;
- (ii)  $p_{T,J1}$ , transverse momentum of leading VBF jet;
- (iii)  $p_{T,J2}$ , transverse momentum of subleading VBF jet;
- (iv)  $E_{J1}$ , energy of the leading VBF jet [109];
- (v)  $E_{J2}$ , energy of the subleading VBF jet [109];
- (vi)  $|\Delta\phi_{JJ}|$ , azimuthal separation [110];
- (vii)  $|\Delta\eta_{JJ}|$ , pseudorapidity gap.

The additional jets that are needed for the two HR channels are not used as inputs. Distributions of the input variables can be found in Ref. [66].

The samples used for the BDT training are the signal and background samples for the  $\text{VBF}_{0\gamma}$  channel, combining the  $\text{HR}_{4b}$  and  $\text{HR}_{3b}$  channels. The output score of the VBF BDT is called  $\mathcal{O}_{\text{VBF}}$ . Figure 3 shows the distributions for  $\text{VBF}_{0\gamma}$  (solid lines).

We find no need to train a separate tagger for the  $\text{VBF}_{1\gamma}$  channel. Figure 3 shows that the signal-background separation for the BDT outputs evaluated on the  $\text{VBF}_{1\gamma}$  sample without a photon requirement (dotted lines) is similar to that of  $\text{VBF}_{0\gamma}$  (solid lines). The  $\text{VBF}_{1\gamma}$  analysis channel requires a photon with  $p_T > 15$  GeV in addition to passing the VBF BDT requirements.

#### C. Higgs taggers

A BDT is also developed to evaluate the non-VBF jets,  $b_1$  to  $b_4$  for  $\text{HR}_{4b}$  and  $b_1$  to  $b_3$  for  $\text{HR}_{3b}$ . In combination with the two pseudoscalar mass scenarios,  $m_a = 25$  GeV

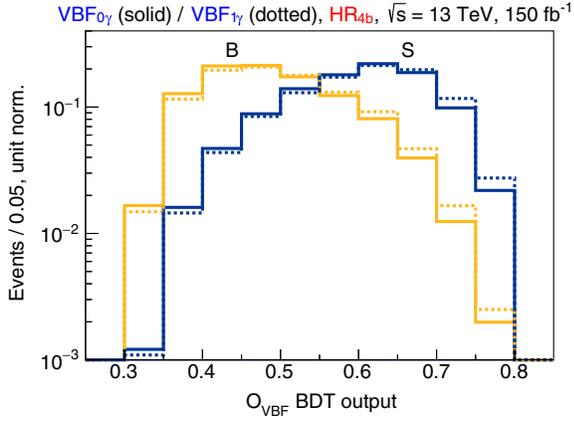


FIG. 3. VBF tagger score distribution. The score distributions are shown for the BDT using only the VBF jets. The unit-normalized distributions are shown for the  $m_a = 50$  GeV the signal ( $S$ , dark-colored lines) and SM background ( $B$ , light-colored lines). The  $\text{VBF}_{0\gamma}$  (solid lines) and  $\text{VBF}_{1\gamma}$  (dotted lines) show similar distributions for the  $S$  and for the  $B$ .

and 50 GeV, this results in four Higgs tagger BDTs with scores denoted as  $O_{4b}^{50}$ ,  $O_{3b}^{50}$ ,  $O_{4b}^{25}$ , and  $O_{3b}^{25}$ .

In the following subsections, the BDT training strategies for the  $\text{HR}_{4b}$  and  $\text{HR}_{3b}$  channels are described. The strategies are identical for the each of the  $m_a$  masses with the only differences being the input signal samples.

### 1. $\text{HR}_{4b}$ channel

Four  $b$  candidate jets are paired to find the two jet pairs associated with each  $a \rightarrow b\bar{b}$  decay. The two jet pairs will have nearly the same invariant mass,  $m_{bb}$ , if they are decays of the  $a$  particle. Therefore, the jet pairings are chosen such that the absolute difference in the sets of the invariant mass,  $\Delta m_{bb} = |m(b_i, b_{i'}) - m(b_{ii}, b_{ii'})|$ , is minimized between two dijet pairs.

TMVA is configured using the same setup as the VBF BDT with the following three input variables:

- (i)  $m_{4b}$ , the invariant mass of the four-jet system;
- (ii)  $\Delta m_{bb}$ , the mass difference between the dijet pairs;
- (iii)  $m_{bb}^{\text{avg}}$ , the average mass of the dijet pairs.

The BDT score distributions for  $m_a = 50$  GeV for the two  $\text{VBF}_{0/1\gamma}$  channels are shown in the first row of Fig. 4. The largest background contribution is from  $b\bar{b}$  with one or more jets produced at LO, which is two orders of magnitude larger than the other backgrounds.

### 2. $\text{HR}_{3b}$ channel

When events are reconstructed with only three  $b$  jets, different selections are used.

TMVA is configured as before. As it is not possible to pair the jets as was done for  $\text{HR}_{4b}$ , the following six input variables are used:

- (i)  $m_{3b}$ , the invariant mass of the three jet system;

- (ii)  $m_{b_1, b_2}$ , the invariant mass of the leading and sub-leading  $b$  jets;
- (iii)  $m_{b_1, b_3}$ , invariant mass of the leading and third-leading  $b$  jets;
- (iv)  $m_{b_2, b_3}$ , invariant mass of the nonleading  $b$  jets;
- (v)  $\Delta R_{bb}^{\text{avg}}$ , average  $\Delta R_{bb}$  of the three dijet pairs [40];
- (vi)  $\Delta R_{bb}^{\text{min}}$ , minimum  $\Delta R_{bb}$  of the three dijet pairs [40].

The BDT score distributions for the  $m_a = 50$  GeV signal in the two  $\text{VBF}_{0/1\gamma}$  channels are shown in the second row of Fig. 4. A similar pattern of background contributions as  $\text{HR}_{4b}$  is seen.

## IV. RESULTS

We present the expected sensitivity using the expected Run-3 data sample of  $150 \text{ fb}^{-1}$  (Sec. IV A), trigger proposals based on our study (Sec. IV B), and HL-LHC projections for  $3 \text{ ab}^{-1}$  (Sec. IV C).

### A. Expected sensitivity for LHC Run-3

The expected sensitivity to  $H_{4b}$  is estimated using a counting experiment. As the backgrounds in a more complete experimental setting will likely rely on data-driven background estimation procedures for the multijet background, no attempt at an estimation of the statistical impact of the simulated sample size or of systematic uncertainties is undertaken. Though systematic uncertainties are expected to reduce the sensitivity, the result is expected to be statistically limited and this choice would not change the conclusions presented here.

Using the VBF tagger and Higgs taggers described in the previous section, we count the numbers of signal ( $S$ ) and background events ( $B$ ). An output score selection is chosen to maximize the sensitivity  $\sigma$  quantified by  $S/\sqrt{B}$ , which is found to be greater than 0.6 for  $O_{\text{VBF}}$  and  $O_{4b/3b}^{50/25}$ . The distributions shown in Fig. 4 are after the VBF tagger selection on  $O_{\text{VBF}}$ , as well as the photon requirement for the  $\text{VBF}_{1\gamma}$  channel.

For  $\text{HR}_{4b}$ , the signal significance in  $\text{VBF}_{0\gamma}$  after  $O_{4b}^{50}$  is  $2.1\sigma$ , corresponding to a signal acceptance of 0.43 and background rejection of 0.993. The signal significance in  $\text{VBF}_{1\gamma}$  after  $O_{4b}^{50}$  is  $1.7\sigma$ , corresponding to a signal acceptance of 0.46 and background rejection of 0.998. (Acceptance is defined as  $\varepsilon = N_{\text{pass}}/N_{\text{total}}$  while rejection is defined as  $1 - \varepsilon$ .) The  $m_{4b}$  distributions after selections on both the VBF and the Higgs tagger is shown in Fig. 5.

For  $\text{HR}_{3b}$ , the signal significance in  $\text{VBF}_{0\gamma}$  after the  $O_{3b}^{50}$  selection is  $4.6\sigma$ , corresponding to a signal acceptance of 0.62 and background rejection of 0.97. The signal significance in  $\text{VBF}_{1\gamma}$  after the  $O_{3b}^{50}$  selection is  $3.1\sigma$ , corresponding to a signal acceptance of 0.64 and background rejection of 0.97.

The above results for  $m_a = 50$  GeV, as well as the results for  $m_a = 10$  GeV, 25 GeV, 35 GeV, are given in Table III, assuming  $\mathcal{B}(H_{4b}) = 1$  and an integrated

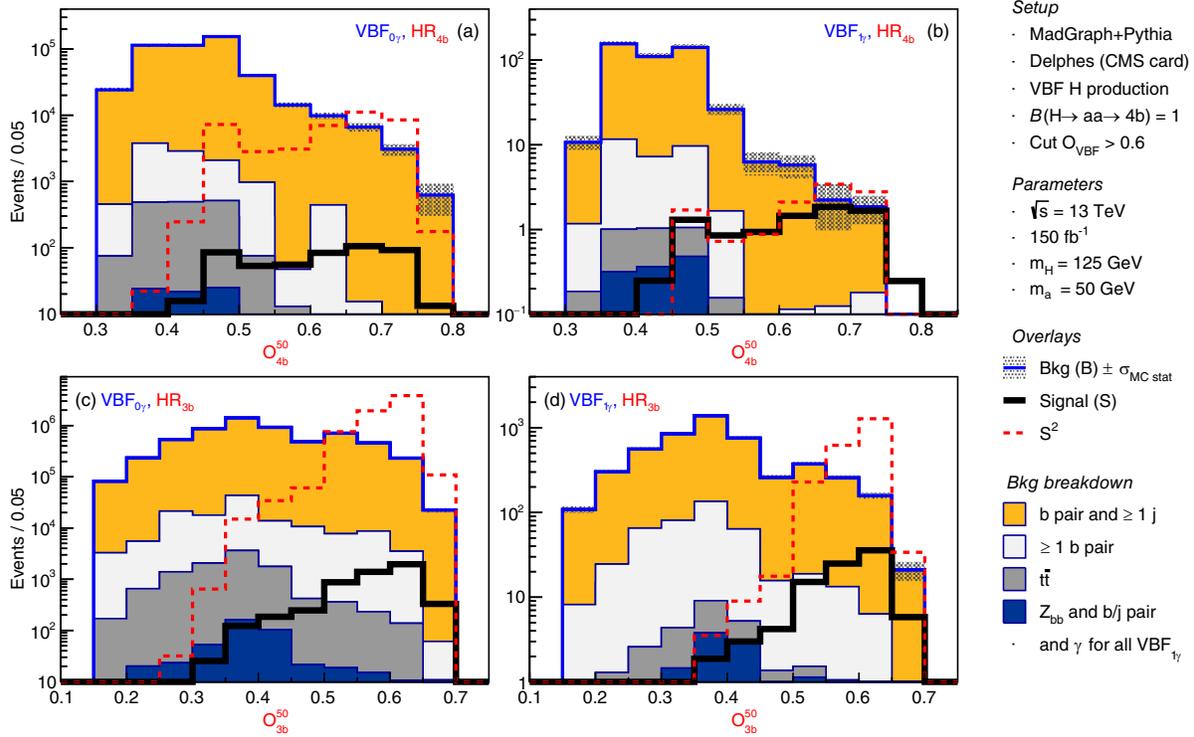


FIG. 4. Higgs tagger score distributions. The distribution  $O_{4b}$  ( $O_{3b}$ ) from the BDT for the two Higgs reconstruction channels  $HR_{4b}$  ( $HR_{3b}$ ) is given in the top row (bottom row). The signal ( $S$ ) is for  $m_a = 50$  GeV assuming  $\mathcal{B}(H_{4b}) = 1$  and the SM background ( $B$ ) are shown for  $VBF_{0\gamma}$  ( $VBF_{1\gamma}$ ) in the left column (right column). Also shown is the squared event count for the signal ( $S^2$ , dotted line) so that  $S/\sqrt{B}$  can be visualized. The statistical error on the MC statistics is shown as the shaded boxes around the background prediction. A selection on the VBF tagger,  $O_{VBF} > 0.6$ , is applied.

luminosity of  $150 \text{ fb}^{-1}$ . A total sensitivity of between  $0.5\sigma$  and  $6\sigma$ , depending on  $m_a$ , is obtained by combining the individual channels. The signal efficiency is greatly reduced for  $m_a = 10$  GeV because the  $b$ -jets from the  $a$ -decay become highly collimated and fewer events pass the  $b$ -tagging selections. These final states with collimated jets could be searched for using alternative analysis strategies, such as those proposed in Ref. [111]. In the

absence of a clear signal, an upper limit on the branching ratio can be derived assuming the SM Higgs cross section. The upper limit on the branching ratio of Higgs to four bottom quarks is estimated using  $2/\sigma$ , the approximate statistics-only sensitivity estimate at 95% confidence level, for  $m_a = 50$  GeV and is found to be 0.33.

As noted in Sec. II A, samples are produced without pileup interactions. To investigate the effects of pileup

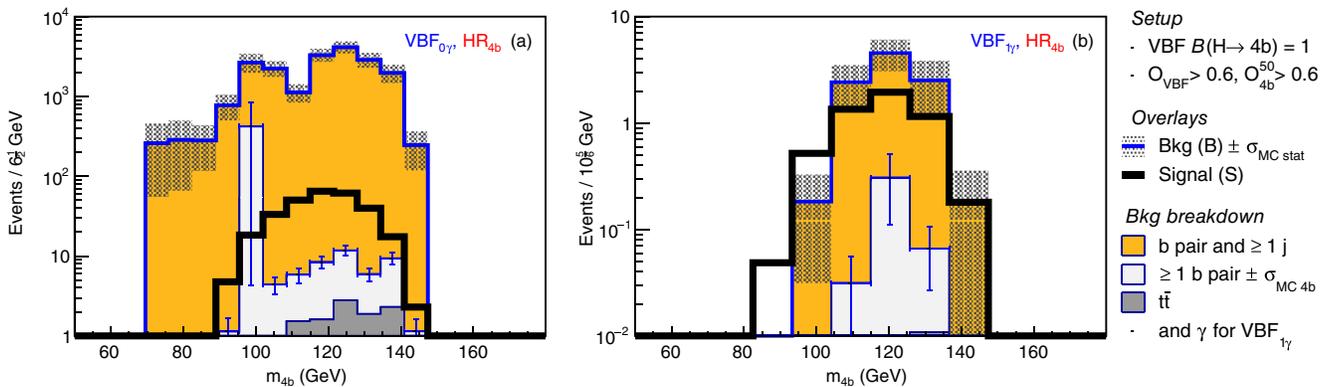


FIG. 5. Four  $b$ -invariant mass. Distributions are shown for  $HR_{4b}$  for the two production channels  $VBF_{0\gamma}$  (left) and  $VBF_{1\gamma}$  (right). The signal is shown for  $m_a = 50$  GeV and selections are made on the Higgs tagger  $O_{4b}^{50} > 0.6$  and the VBF tagger  $O_{VBF} > 0.6$ . We refer to the caption of Fig. 4 for the technical aspects of the plots.

TABLE III. Event counts for the number of signal  $S$  assuming  $\mathcal{B}(H_{4b}) = 1$  and background  $B$  (top half) and estimated sensitivity  $\sigma$  (bottom half) using  $150 \text{ fb}^{-1}$  of data. The analysis is performed with a BDT VBF trigger and BDT Higgs tagger for the signal samples with  $m_a = 50 \text{ GeV}$  (a) and  $25 \text{ GeV}$  (b). In this table,  $n_j$  refers to the number of hadronic jets of any flavor and  $n_b$  the subset identified as  $b$ -quark jets.

(a) Event counts									
	VBF <sub>0<math>\gamma</math></sub> prod. chan. ....				VBF <sub>1<math>\gamma</math></sub> prod. chan. ....				
	HR <sub>4b</sub> reco. chan.		HR <sub>3b</sub> reco. chan.		HR <sub>4b</sub> reco. chan.		HR <sub>3b</sub> reco. chan.		
	$S$	$B$	$S$	$B$	$S$	$B$	$S$	$B$	
Total events for $150 \text{ fb}^{-1}$	$5.7 \times 10^5$	$6.5 \times 10^{11}$	.....	.....	$1.4 \times 10^4$	$2.9 \times 10^8$	.....	.....	.....
For $m_a = 50 \text{ GeV}$									
$n_j = 6$ for HR <sub>4b</sub> , $n_j = 5$ for HR <sub>3b</sub>	$6.6 \times 10^4$	$3.5 \times 10^9$	$1.4 \times 10^5$	$9.2 \times 10^9$	2096	$6.4 \times 10^6$	3986	$1.4 \times 10^7$	
$n_b = 4$ for HR <sub>4b</sub> , $n_b = 3$ for HR <sub>3b</sub>	965	$3.5 \times 10^6$	$1.2 \times 10^4$	$7.6 \times 10^7$	29.8	8661	324	$1.5 \times 10^5$	
VBF production selections	509	$4.8 \times 10^5$	5146	$6.0 \times 10^6$	8.6	460	91.2	5028	
Higgs reconstruction selections	295	$2.0 \times 10^4$	2293	$2.5 \times 10^5$	5.2	9.9	41.6	178	
For $m_a = 35 \text{ GeV}$									
$n_j = 6$ for HR <sub>4b</sub> , $n_j = 5$ for HR <sub>3b</sub>	$6.3 \times 10^4$	$3.5 \times 10^9$	$1.4 \times 10^5$	$9.2 \times 10^9$	1975	$6.4 \times 10^6$	3826	$1.4 \times 10^7$	
$n_b = 4$ for HR <sub>4b</sub> , $n_b = 3$ for HR <sub>3b</sub>	994	$3.5 \times 10^6$	11934	$7.6 \times 10^7$	29	8661	309	$1.5 \times 10^5$	
VBF production selections	501	$4.8 \times 10^5$	4379	$6.0 \times 10^6$	8.2	460	77	5028	
Higgs reconstruction selections	280	7799	1686	$2.2 \times 10^5$	4.6	5.4	30	157	
For $m_a = 25 \text{ GeV}$									
$n_j = 6$ for HR <sub>4b</sub> , $n_j = 5$ for HR <sub>3b</sub>	$5.2 \times 10^4$	$3.5 \times 10^9$	$1.3 \times 10^5$	$9.2 \times 10^9$	1427	$6.4 \times 10^6$	3155	$1.44 \times 10^7$	
$n_b = 4$ for HR <sub>4b</sub> , $n_b = 3$ for HR <sub>3b</sub>	527	$3.5 \times 10^6$	8535	$7.6 \times 10^7$	13.5	8661	194	$1.5 \times 10^5$	
VBF production selections	165	$4.8 \times 10^5$	2455	$6.0 \times 10^6$	2.4	460	39	5028	
Higgs reconstruction selections	72	3518	1522	$2.1 \times 10^5$	1.1	0.8	25	150	
For $m_a = 10 \text{ GeV}$									
$n_j = 6$ for HR <sub>4b</sub> , $n_j = 5$ for HR <sub>3b</sub>	$3.6 \times 10^4$	$3.5 \times 10^9$	$1.1 \times 10^6$	$9.2 \times 10^9$	1173	$6.4 \times 10^6$	3281	$1.44 \times 10^7$	
$n_b = 4$ for HR <sub>4b</sub> , $n_b = 3$ for HR <sub>3b</sub>	42.7	$3.5 \times 10^6$	1186	$7.6 \times 10^7$	1.15	8661	41.4	$1.5 \times 10^5$	
VBF production selections	21.9	$4.8 \times 10^5$	419	$6.0 \times 10^6$	0.32	460	7.3	5028	
Higgs reconstruction selections	7.44	1609	250	$3.2 \times 10^6$	0.02	1.3	4.01	365	

(b) Signal sensitivity									
	VBF <sub>0<math>\gamma</math></sub> prod. chan. ....				VBF <sub>1<math>\gamma</math></sub> prod. chan. ....				
	HR <sub>4b</sub> reco. chan.		HR <sub>3b</sub> reco. chan.		HR <sub>4b</sub> reco. chan.		HR <sub>3b</sub> reco. chan.		
	.....	.....	.....	.....	.....	.....	.....	.....	
For $m_a = 50 \text{ GeV}$									
Per Higgs reco. chan.	$2.1\sigma$	.....	$4.6\sigma$	.....	$1.7\sigma$	.....	$3.1\sigma$	.....	.....
Per VBF prod. chan.	$5.1\sigma$	.....	.....	.....	$3.5\sigma$	.....	.....	.....	.....
All combined	$6.1\sigma$	.....	.....	.....	.....	.....	.....	.....	.....
For $m_a = 35 \text{ GeV}$									
Per Higgs reco. chan.	$3.2\sigma$	.....	$3.6\sigma$	.....	$2.0\sigma$	.....	$2.4\sigma$	.....	.....
Per VBF prod. chan.	$4.8\sigma$	.....	.....	.....	$3.1\sigma$	.....	.....	.....	.....
All combined	$5.7\sigma$	.....	.....	.....	.....	.....	.....	.....	.....
For $m_a = 25 \text{ GeV}$									
Per Higgs reco. chan.	$1.2\sigma$	.....	$3.3\sigma$	.....	$1.2\sigma$	.....	$2.0\sigma$	.....	.....
Per VBF prod. chan.	$3.5\sigma$	.....	.....	.....	$2.3\sigma$	.....	.....	.....	.....
All combined	$4.2\sigma$	.....	.....	.....	.....	.....	.....	.....	.....
For $m_a = 10 \text{ GeV}$									
Per Higgs reco. chan.	$0.2\sigma$	.....	$0.4\sigma$	.....	$0.0\sigma$	.....	$0.2\sigma$	.....	.....
Per VBF prod. chan.	$0.5\sigma$	.....	.....	.....	$0.2\sigma$	.....	.....	.....	.....
All combined	$0.5\sigma$	.....	.....	.....	.....	.....	.....	.....	.....

TABLE IV. Sensitivity estimates for the  $m_a = 50$  GeV model assuming  $\mathcal{B}(H_{4b}) = 1$ , using  $150 \text{ fb}^{-1}$  of data, the statistical sensitivity  $S/\sqrt{B}$  of all final states after applying VBF and final-state selections. Sensitivity is presented for using the ATLAS-inspired VBF HLT cut-based trigger, the CMS-inspired VBF L1 cut-based trigger, and our VBF cut-based trigger selections are presented here. Selections on the Higgs taggers corresponding to the HR channels are applied. For the  $\text{VBF}_{1\gamma}$  channel, a photon  $p_T > 15$  GeV threshold is used for all analyses.

	VBF $_{0\gamma}$ production channel		VBF $_{1\gamma}$ production channel	
	HR $_{4b}$ reco. chan.	HR $_{3b}$ reco. chan.	HR $_{4b}$ reco. chan.	HR $_{3b}$ reco. chan.
Our VBF BDT (from Table III)				
Per Higgs reco. chan.	$2.1\sigma$	$4.6\sigma$	$1.7\sigma$	$3.1\sigma$
Per VBF production channel	$5.1\sigma$		$3.5\sigma$	
Combined	$6.1\sigma$			
Our VBF cut-based trigger				
Per Higgs reco. chan.	$1.5\sigma$	$3.2\sigma$	$1.5\sigma$	$2.5\sigma$
Per VBF production channel	$3.5\sigma$		$2.9\sigma$	
Combined	$4.5\sigma$			
ATLAS-inspired VBF trigger				
Per Higgs reco. chan.	$0.8\sigma$	$1.7\sigma$	$0.7\sigma$	$1.0\sigma$
Per VBF production channel	$1.9\sigma$		$1.2\sigma$	
Combined	$2.2\sigma$			
CMS-inspired VBF trigger				
Per Higgs reco. chan.	$0.9\sigma$	$1.6\sigma$	$1.0\sigma$	$1.0\sigma$
Per VBF production channel	$1.8\sigma$		$1.4\sigma$	
Combined	$2.3\sigma$			

on the signal sensitivity, a small sample of VBF $_{0\gamma}$  signal with a mean pileup of  $\langle\mu\rangle = 50$  is generated. For the VBF tagger, we find that 38% of the pile-up events pass compared to 39% of the events without pileup. Similarly for the  $O_{4b}^{50}$  Higgs tagger, we find that 50% of the pile-up events pass compared to 69% of the events without pileup. The latter indicates that pileup may have up to a 30% relative impact on the upper limit presented above.

## B. Trigger optimization

We first compare various VBF jet trigger possibilities that affects both the VBF $_{0\gamma}$  and VBF $_{1\gamma}$  channels. Then we discuss the effect of the photon  $p_T$  threshold for the VBF $_{1\gamma}$  channel.

### 1. VBF trigger comparisons

In Sec. III A, we noted that optimistic assumptions were made about what data would be available from the trigger. Here, we revisit those assumptions, considering a range of alternate VBF triggers to compare to our BDT-based VBF tagger:

- (i) Cuts—our cut-based proposal made below on the VBF jets inspired by similar studies [3,4,55,56,112];
- (ii) ATLAS—ATLAS-inspired VBF trigger selections [73,113];
- (iii) CMS—CMS-inspired VBF trigger selections [69].

As a comparison to the VBF BDT, we demonstrate cut-based selections on the VBF jets that could be implemented in the ATLAS trigger without using a BDT in the L1 trigger.

Our cut-based proposal is as follows:

- (i)  $p_{T,J1} > 50$  GeV;
- (ii)  $p_{T,J2} > 50$  GeV;
- (iii)  $m_{JJ} > 1000$  GeV;
- (iv)  $|\Delta\eta_{JJ}| > 3$ ;
- (v)  $|\Delta\phi_{JJ}| < 2$ .

The ATLAS-inspired VBF trigger follows ATLAS's implementation that only utilizes the VBF jets, with no additional requirements, in the L1 subsystem that computes topological variables such as the invariant mass [73,113]. The set of offline selections, applied after the trigger, above which the trigger is greater than 95% efficient is given as follows:

- (i)  $p_{T,J1} > 90$  GeV;
- (ii)  $p_{T,J2} > 80$  GeV;
- (iii)  $|\eta_{J1}| < 3.2$ ;
- (iv)  $m_{JJ} > 1300$  GeV;
- (v)  $|\Delta\eta_{JJ}| > 4$ ;
- (vi)  $|\Delta\phi_{JJ}| < 2$ .

Approximately  $40 \text{ fb}^{-1}$  of data with this trigger was collected during 2018 [73]. We utilize the offline selections for our ATLAS-inspired L1 selections.

The CMS-inspired VBF trigger follows CMS's implementation of a similar VBF trigger [69]. The set of offline trigger selections is given as follows:

- (i)  $p_{T,J1} > 150$  GeV;
- (ii)  $p_{T,J2} > 60$  GeV;
- (iii)  $m_{JJ} > 800$  GeV.

A comparison of the results using the BDT-based trigger as well as the three introduced above is given in Table IV.

The table shows the sensitivity  $\sigma$  using  $S/\sqrt{B}$ . The VBF BDT achieves  $6\sigma$  while the others range from  $2\sigma$  to  $4\sigma$ . This results confirms and expands on the previous findings of Ref. [66].

## 2. Photon threshold for VBF trigger

$VBF_{1\gamma}$  is a useful target for triggering because requiring a photon enables a significant reduction of the QCD multijet background. Therefore, with a photon, it is possible to implement a trigger with relatively low  $p_T$  thresholds for VBF jets. As the current L1 trigger saves events with an electron or photon  $p_T > 25$  GeV [114], many of these events are already saved by the trigger. Stricter selections can be used to further isolate signal at the HLT using VBF jets or  $b$ -tagging information.

For these reasons,  $VBF_{1\gamma}$  has already been used in published analyses. For example, the ATLAS experiment searched for  $H \rightarrow b\bar{b}$  with triggers requiring a photon with  $p_T > 30$  GeV, four or more jets with  $p_T > 40$  GeV, a VBF pair with  $m_{JJ} > 700$  GeV, and one or more  $b$ -tagged jet using 77% efficiency selections [56,112]. The trigger used in the study is similar to the selections described in Sec. III B; it obtains a similar sensitivity to that reported in this study. For the  $H_{4b}$  search, however, a modification is necessary because the  $p_T > 40$  GeV jet threshold significantly reduces signal acceptance. A modified approach could apply a tighter  $m_{JJ}$  threshold with a lower jet  $p_T$  threshold. Additional details of the ATLAS trigger menu can be found in Refs. [70–73].

The results shown so far in Tables III and IV assume a threshold of photon  $p_T > 15$  GeV.

To evaluate the effect of varying the threshold of photon  $p_T$ , we evaluate the sensitivity as a function of photon  $p_T$  for three VBF trigger scenarios: our VBF BDT trigger, our VBF cut-based trigger, and the ATLAS-inspired VBF trigger. The sensitivity as a function of photon  $p_T$  is shown in Fig. 6. The plot shows that lower photon  $p_T$  thresholds can increase the sensitivity by a factor of 1.5 for the  $HR_{3b}$  category. We leave the details and implementation to the experiments, but the studies here can be used as benchmarks.

## C. HL-LHC projection

The HL-LHC is projected to collect approximately  $\int \mathcal{L} dt = 3 \text{ ab}^{-1}$  of data, 20 times the  $150 \text{ fb}^{-1}$  assumed so far in this paper [115]. This increase in data improves the statistical sensitivity, resulting in an upper limit on branching ratio on the Higgs decay to four bottom quarks of 9% in the  $VBF_{0\gamma}$  channel and 13% in the  $VBF_{1\gamma}$  channel at the 95% confidence level. A combination of the two production channels results in an upper limit on the branching ratio of 7% at 95% confidence level for  $m_a = 50$  GeV. There is an expected increase in  $\sqrt{s}$  from 13.6 TeV at the LHC Run-3 to 14 TeV at HL-LHC. As stated previously for

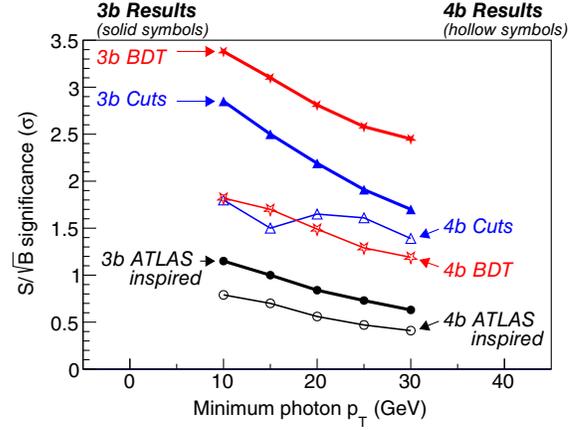


FIG. 6. Sensitivity vs photon  $p_T$  for the  $VBF_{1\gamma}$  channel. The selections labeled ‘ATLAS inspired’ refer to the selections using the ATLAS VBF trigger; see Sec. IV B. A photon  $p_T > 15$  GeV threshold is used for the nominal  $VBF_{1\gamma}$  analysis in this paper.

the increase from 13 TeV to 13.6 TeV, we do not expect the  $\sqrt{s}$  increase to alter the conclusions presented here by more than a few relative percent.

## V. CONCLUSIONS

We have presented a detailed study of VBF Higgs production with and without a photon in the  $H \rightarrow aa \rightarrow 4b$  decay chain. To estimate the signal sensitivity, two relatively simple BDTs are deployed; one for the VBF jets for a ‘VBF tagger’, and one for the reconstructed Higgs decay for a ‘Higgs tagger’. Comparable sensitivity is found for the two VBF channels, with a combined sensitivity of over  $6\sigma$  assuming a  $150 \text{ fb}^{-1}$  dataset for  $m_a = 50$  GeV.

The photon provides an additional way to retrieve events from the L1 trigger. We find that including the production channel with a photon yields a significantly improved combined sensitivity. We recommend that the LHC experiments provide combined triggers using photons and VBF jets in order to support this analysis for Run 3 and the HL-LHC. The sensitivity of the proposed search was estimated using thresholds that may be implementable in the L1 trigger systems of ATLAS or CMS. To motivate these choices, we compare to existing triggers that are available in public documentation and provide benchmark selections to indicate the possible improvements. These results assume prompt decays of the  $a$ , but the conclusions regarding the trigger proposals are also relevant for longer lifetimes, such as those discussed in Ref. [36].

A threshold-based ‘cuts’ trigger yields sensitivity of up to  $2.3\sigma$  for the current experiment triggers considered and up to  $4.5\sigma$  for our proposed cut-based trigger. While these triggers produce a good sensitivity, the BDT-based trigger yields the best results. The availability of ML-on-FPGA packages allows for the implementation of BDT-based triggers at L1. These tools will continue to enable improved

sensitivity in searches for rare signals, such as the one presented here.

Looking forward, the development of low-latency and resource-efficient ML implementations are paving way to more sophisticated constructions of artificial intelligence (AI) methods on FPGA, such as autoencoder-based anomaly detectors constructed using hls4ml-based neural networks [116] and FWXMACHINA-based decision trees [117]. Such AI algorithms that were previously only executed in an offline environment may present opportunities for further improvements in the L1 trigger systems.

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