# MVA method in $\mathrm{ZH} \rightarrow$ $q q \gamma \gamma$ analysis in CEPC 

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## Review of CEPC CDR

## CEPC CDR release: Nov 2018, IHEP

Higgs $\rightarrow \gamma \gamma$ physics analysis:

- Design point at CEPC_v4, $\sqrt{s}=240 \mathrm{GeV}, \mathcal{L}=$ $5.6 a b^{-1}$
- Whizard 1.95 + MoccaC generator, dedicated fast simulation based on parametrized detector response.
- Considered $H \rightarrow \gamma \gamma$ signal and 2 fermion dominant background
- Result: $\delta(\operatorname{Br}(H \rightarrow \gamma \gamma) \times \sigma(Z H))=6.84 \%$ in 3 combined channel, and $9.84 \%$ in $q \bar{q} \gamma \gamma$ channel.

Could be improved by applying MVA method


Figure1. di-photon invariant mass distributions in 3 sub-channel

## Results

The combination of three sub-channel provides a final result of $\sigma(Z H) \times B R(H \rightarrow \gamma \gamma)$ measurement precision

| Sub-channel | $q \bar{q} \gamma \gamma$ | $\bar{l} \gamma \gamma$ | $v \bar{v} \gamma \gamma$ | combined |
| :---: | :---: | :---: | :---: | :---: |
| precision | $9.84 \%$ | $23.7 \%$ | $10.5 \%$ | $6.84 \%$ |

Arxiv: 1810.09037
Report in 2018 CEPC WS

## MC sample and simulation

In order to keep consistent with CDR:
MC sample:

- Signal: $e e \rightarrow Z H \rightarrow q \bar{q} \gamma \gamma, 100$ k events.
- Background: ee $\rightarrow q q+$ radiation photons, 20M events.


## Simulation and event reconstruction

- Fast simulation: smear the objects with the resolution and efficiency with parametrized detector response, $\frac{\Delta E}{E} \sim \frac{16 \%}{\sqrt{E}} \oplus 1 \%$
- Event reconstruction: FSClasser FastJetClustering processer. reconstructed 2 on-shell photon with $m_{\gamma \gamma} \sim 125 \mathrm{GeV}$ and 2 jets define: $\gamma_{1} / j_{1}$ as photon/jet with lower energy, and $\gamma_{2} / j_{2}$ as higher energy one.


## Event selection adjustment

Release the event selection criteria for the further MVA method

> Selection in CDR: $$
\begin{array}{l}E_{\gamma 1}>35 \mathrm{GeV} \\ 35 \mathrm{GeV}<E_{\gamma 2}<96 \mathrm{GeV} \\ \cos \theta_{\gamma \gamma}>-0.95, \cos \theta_{j j}>-0.95 \\ p T_{\gamma 1}>20 \mathrm{GeV}, p T_{\gamma 1}>30 \mathrm{GeV} \\ 110 \mathrm{GeV}<m_{\gamma \gamma}<140 \mathrm{GeV} \\ 125 \mathrm{GeV}<E_{\gamma \gamma}<145 \mathrm{GeV} \\ \min \left|\cos \theta_{\gamma j}\right|<0.9\end{array}
$$

| Old | signal | background |
| :--- | :--- | :--- |
| Total efficiency | $53.08 \%$ | $0.010 \%$ |
| Scaled to $5.6 a b^{-1}$ | 923.13 | 29875.6 |

Present:

$$
\begin{aligned}
& E_{\gamma 1}>25 \mathrm{GeV} \\
& 35 \mathrm{GeV}<E_{\gamma 2}<96 \mathrm{GeV} \\
& \cos \theta_{\gamma \gamma}>-0.95, \cos \theta_{j j}>-0.95 \\
& p T_{\gamma 1}>20 \mathrm{GeV}, p T_{\gamma 1}>30 \mathrm{GeV} \\
& 110 \mathrm{GeV}<m_{\gamma \gamma}<140 \mathrm{GeV} \\
& E_{\gamma \gamma}>120 \mathrm{GeV} \\
& \min \left|\cos \theta_{\gamma j}\right|<0.9
\end{aligned}
$$

| New | signal | background |
| :--- | :--- | :--- |
| Total efficiency | $53.34 \%$ | $0.010 \%$ |
| Scaled to $5.6 \mathrm{ab}^{-1}$ | 927.65 | 31587.6 |

## MVA method

Considered variables:

- P, E, pT, $\cos \theta$ of two photon and 2 jets
- P, E, pT, $\cos \theta$, recoil mass, pTt, Pt* of di-photon system
- P, E, mass, recoil mass, $\cos \theta$ of jj system
- $\Delta P, \Delta E, \Delta \phi$ between two photon, $\gamma \gamma$-qq
- Cosine angle between 2 photon, 2 jets, 1 photon and 1 jet, $\gamma \gamma$ and jj system.
- Minimum $\Delta R$ between any photon and jet

Totally 42 variables
Pt*: Di-photon P projected perpendicular to the di-
photon thrust axis.(similar as pTt but replace pT with P )
Separation power:

$$
\mathrm{pTt}=\left|\left(\overrightarrow{P_{1}}+\overrightarrow{P_{2}}\right) \times \frac{\overrightarrow{P_{1}}-\overrightarrow{P_{2}}}{\left|\overrightarrow{P_{1}}-\overrightarrow{P_{2}}\right|}\right|
$$

$$
<S^{2}>=\frac{1}{2} \int \frac{\left(\hat{y}_{s}(y)-\hat{y}_{b}(y)\right)^{2}}{\hat{y}_{s}(y)+\hat{y}_{b}(y)} d y .
$$

## $y$ : discriminating variable

$\hat{y}_{S}(y)$ and $\hat{y}_{B}(y)$ : the distributions of the variable for signal and background samples

## MVA method

Variable correlation matrix


First step: remove high $m_{\gamma \gamma}$-related variable $\quad\left|\operatorname{Corr}_{v-m_{\gamma \gamma}}\right|<30 \%$
Second step: remove high co-related variables $\left|\operatorname{Corr}_{v_{1}-v_{2}}\right|<40 \%$

## MVA method

Remaining variables:

| Variable | Definition | $\left\langle S^{2}\right\rangle$ |
| :--- | :--- | :---: |
| $p T_{\gamma 1} / p T_{\gamma 2}$ | pT of $\gamma 1$ or $\gamma 2$ | $0.39 / 0.30$ |
| $\cos \theta_{\gamma 2}$ | Cosine polar angle of $\gamma 2$ | 0.39 |
| $\left\|\Delta \Phi_{\gamma \gamma}\right\|$ | $\|\Delta \Phi\|$ between 2 photon | 0.30 |
| $\min \Delta R_{\gamma, j}$ | Minimum $\Delta R$ between photon and jet | 0.09 |
| $\cos \theta_{j 1}$ | Cosine polar angle of $j 1$ | 0.08 |
| $p T_{j 2}$ | pT of $j 2$ | 0.08 |
| $E_{j 1}$ | Energy of $j 1$ | 0.03 |
| $\cos \theta_{\gamma 2-j 2}$ | Cosine value of the angle between $\gamma 2$ and $j 2$ | 0.03 |
| $\cos \theta_{\gamma 1-j 1}$ | Cosine value of the angle between $\gamma 1$ and $j 1$ | 0.02 |
| $\left\|\Delta \Phi_{\gamma \gamma-j j}\right\|$ | $\|\Delta \Phi\|$ between $\gamma \gamma$ and $j j$ system | 0.01 |
| $\cos \theta_{\gamma \gamma-j j}$ | Cosine value of the angle between $\gamma \gamma$ and $j j$ system | 0.01 |

## BDT training parameter:

"BDTG","NTrees=900:nEventsMin=50:BoostType=Grad:Shrinkage=0.06:UseBaggedGrad:GradBaggingFracti on=0.6:nCuts=20:MaxDepth=3"

## MVA method







[nput variable: minDellar_y_]


MVA variables distribution for signal(blue) and background(red)

## MVA method







MVA variables distribution(left) and BDT response(right) for signal(blue) and background(red)
$\mid$ Corr $_{m_{\gamma \gamma}-\text { BDTout }} \mid$ is $5.4 \%$ in signal and $17 \%$ in background

## 2-D signal and background fit

Fit the sample in 2 dimension

- Di-photon invariant mass $m_{\gamma \gamma}$

Signal: Gaussian PDF
Background: $2^{\text {nd }}$ polynomial exponential PDF $P D F_{m_{\gamma \gamma}}=\mu \times N_{s i g}^{S M} \times P D F_{s i g}+N_{b k g} \times P D F_{b k g}$

- BDT response ( $\mid$ Corr $_{m_{\gamma \gamma}-B D T} \mid<20 \%$ )

Binned PDF for signal and background

$$
P D F_{B D T}=\mu \times N_{s i g}^{S M} \times P D F_{s i g}+N_{b k g} \times P D F_{b k g}
$$

- $P D F_{2 D}=P D F_{m_{\gamma \gamma}} \times P D F_{B D T}$


## Results

Fit result in $e e \rightarrow Z H \rightarrow q q \gamma \gamma$ channel

$$
\mu=1.000 \pm 0.066
$$

|  | $q q y \gamma$ channel | 3 Combined channel |
| :--- | :--- | :--- |
| Pre MVA (CDR result) | $9.84 \%$ | $6.80 \%$ |
| After MVA | $6.56 \%$ | $5.39 \%$ |
| Improvement | $33 \%$ | $21 \%$ |

*combined results are based on MVA $q q \gamma \gamma+$ no MVA $(l l \gamma \gamma+\nu v \gamma \gamma)$

## Future work

MVA method in $Z H \rightarrow l l \gamma \gamma, Z H \rightarrow \nu \nu \gamma \gamma$ channel

- Estimation: if the same improvement(30\%) could be reached in these two channel
lly channel: $23.7 \% \Rightarrow 16.6 \%$
$v v \gamma \gamma$ channel: $10.5 \% \Rightarrow 7.4 \%$
combined results after MVA: ~4.7\%

Simulation sample

- Update the fast simulation sample to full simulation

Signal: broaden the $m_{\gamma \gamma}$ distribution, lose $\sim 7.5 \%$ events
Background: include more high energy photon, might be excluded by reconstruction algorithm.

## Conclusion

MVA method improvement in CEPC $H \rightarrow \gamma \gamma$ analysis

- $q q \gamma \gamma$ channel has been tested: $33 \%$ improvement in one sub-channel, reaching the result $\delta(\mathrm{Br} \times \sigma)=$ 6.56\%
- Prospect: $4.7 \%$ combined precision could be reached after MVA in 3 channels


## Next step towards TDR

- Full simulation samples are ready, but a accurate reconstruction algorithm is necessary
- Based on previous study, a $\sim 20 \%$ decrease would appear after converting to full simulation


## Back up

## Correlation matrix (after removing $m_{\gamma \gamma}$-related variables)

## Correlation Matrix (signal)



## Correlation Matrix (background)



