# Moscow International School of Physics 2022



MEPhl@ATLAS meeting, 7 October 2022 Presented by Katerina Kazakova



Department of elementary particle physics



## About the school

### What? Where? When?

- MISP school takes place every year and is aimed
- at advanced students, PhD students and young postdocs working in high-energy physics
  - The program covers experimental and
- theoretical HEP, cosmology, machine learning and mathematical physics
- MISP was held from 24 July till 2 August in Dubna



### Organized by:



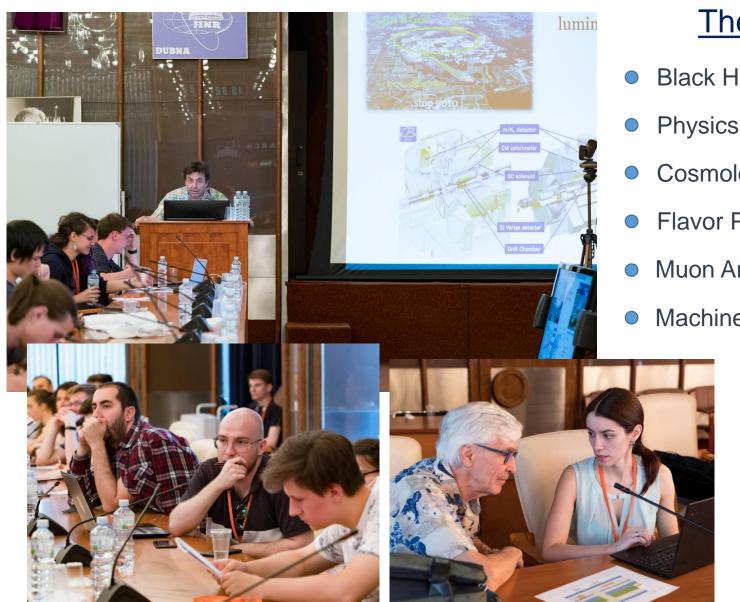






Skolkovo Institute of Science and Technology

## Scientific program



### The most interesting courses:

- Black Holes and Gravitational Waves by E. Babichev
- Physics beyond the Standard Model by E. Boos
- Cosmology and Particle Physics by V. Rubakov
- Flavor Physics by P. Pakhlov
- Muon Anomalous Magnetic Moment by I. Logashenko
- Machine Learning for Physicists by E. Burnaev
  - Trends in Modern Theoretical Physics for Pedestrians" by A. Marshako
  - Neutrino Physics" by V. Naumov
  - Physics at Energy Frontier" by S. Shmatov

## Young scientists forum



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### Likelihood fit based estimation of the background induced by the misidentification of a jet as a photon at *pp* collider experiment



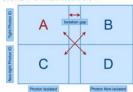
K. Kazakova, E. Soldatov, D. Pyatiizbyantseva, K. Savelyev

#### Introduction

Background processes emerging from object misidentification are not well-modeled in Monte-Carlo (MC). Data-driven methods are usually used to obtain more accurate estimates for such backgrounds. One of these methods — two-dimensional sideband method (ABCD-method) is used by many physics analyses at the LHC. However, it is rather laborious. In this study the alternative maximum likelihood based method of the estimation of the background from object misidentification was developed.

#### Methodology

In the estimation of the background arising from the misidentification of jet as a photon ( $jet \rightarrow \gamma$ ) ABCD-method splits the phase space basing on identification ( $tight^1$  and loose) and isolation ( $isolated^2$  and non-isolated) criteria for photons. Signal region (SR) A that should mainly consist of signal events and control regions (CR) B, C and D that should consist of background events are illustrated below.



The main assumption of the ABCD-method is the absence of the correlation, that corresponds to  $R = \frac{N_A N_D}{N_B N_C} = 1$ . The developed likelihood-based approach uses more general relationships between regions and takes into account the shape of distributions in each region [1]. The essence of the method is to perform a fit [2] of the likelihood function, that is defined as:

$$L(N_{ji}|f_{F_{ji}},f_{N_{j}}) = \prod_{j=A}^{B,C,D} \prod_{i=1}^{N_{bins}} Pois(N_{ji}|\nu_{b_{ji}} + \nu_{\gamma_{ji}}f_{F_{ji}} + \nu_{s_{ji}}f_{N_{j}}),$$

where model parameters are defined as:

<sup>1</sup>Tight photon satisfies all criteria of the EM shower shape; <sup>2</sup>Isolated photon satisfies  $E_T^{cone40} - 0.022p_T < 2.45$  GeV; <sup>3</sup>Asimov data is a sum of all MC processes

- $f_{N_i}$  varying parameter for signal in each region;
- $\bullet f_{F_{jj}}$  varying parameter for estimated background in each region and bin;
- $\nu_{b_{ji}}$  number of events in MC backgrounds (exc.  $jet \rightarrow \gamma$ );
- ν<sub>s</sub> number of signal events;
- $\nu_{\gamma_u}$  number of estimated background ( $jet \rightarrow \gamma$ ) events.

It is constructed with the assumption that R=1 for each bin in the distribution for  $jet \rightarrow \gamma$  background:

$$1 = \frac{\nu_{\gamma_{Ai}} f_{F_{Ai}} \cdot \nu_{\gamma_{Di}} f_{F_{Di}}}{\nu_{\gamma_{Bi}} f_{F_{Bi}} \cdot \nu_{\gamma_{Ci}} f_{F_{Ci}}}$$

To avoid the redundancy of the model the following limitations are applied:  $f_{F_{Bl}} = f_{F_{Dl}}$ . In this way the number of  $jet \to \gamma$  events in SR:  $N_A^{jet \to \gamma} = \nu_{\gamma_A l} f_{F_A l}$ .

The proposed method significantly reduces the number of steps to be done to obtain the estimate compared to ABCD-method.

#### The results of the fit

The likelihood-based approach was applied to associated  $Z\gamma$  production with Z-boson decaying into neutrinos ( $Z \to \nu \bar{\nu}$ ). One of the backgrounds comes from  $\gamma$ +j events, when large  $E_T^{\rm miss}$  is created by a combination of mismeasured jet energy and real  $E_T^{\rm miss}$  from heavy quarks decays. Zj events come from  $jet \to \gamma$  misidentification. The phase space of SR used in the analysis is defined in the table below.

Selection	Cut value		
Emiss	> 130 GeV		
$E_{\mathrm{T}}^{\gamma}$	> 150 GeV		
Number of tight photons	$N_{\gamma} = 1$		
Lepton veto	$N_e = 0, N_{\mu} = 0$		

The processes considered in the analysis were generated in MadGraph5.aMC [3] MC³ event generator using pp-collisions with  $\sqrt{s}=13$  TeV and the integrated luminosity of 139 fb $^{-1}$ . Pythia8 [4] and Delphes [5] were used for parton showering and hadronization and detector simulation respectively. The fit was performed for  $\phi_{\gamma}$  and  $\eta_{\gamma}$ . Table on the right represents the estimates depending on  $N_{bins}$ . The final estimate is chosen based on the  $\chi^2/N_{d.o.f}$ , value in SR. The estimate of  $jet \to \gamma$  events in SR obtained by likelihood method is  $N_A^{jet \to \gamma}=3179_{-108}^{+117}\pm69$ 

events for  $\phi_{\gamma}$  and  $N_A^{jet\to\gamma}=3243^{+126}_{-122}\pm48$  events for  $\eta_{\gamma}$ . The MC prediction is  $N^{jet\to\gamma}=3093\pm178$  events.

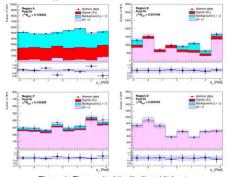


Figure 1: The result of the likelihood fit for  $\phi_{\gamma}$ 

NT.	Estimate R-factor $\chi^2/N_{d.o.f.}$			$\eta_{\gamma}$		
Nbins	Estimate	R-factor	$\chi^2/N_{d.o.f.}$	Estimate	R-factor	$\chi^2/N_{d.o.f.}$
6	3255+111	$1.04 \pm 0.03$	0.45	3238+129	$1.03 \pm 0.03$	0.39
7	2906+110	$0.94 \pm 0.03$	0.73	3243+126	$1.04 \pm 0.02$	0.55
8	3179+117	$1.04 \pm 0.03$	0.73	3276+141	$1.04 \pm 0.02$	0.26
9	3119+130	$1.01 \pm 0.03$	0.62	3251+133	$1.05 \pm 0.02$	0.50

#### **Conclusions**

The alternative likelihood-based method of estimation of  $jet \rightarrow \gamma$  events was developed. It uses the information about the shape of the distributions in the regions and provides the much simpler way to obtain the estimate of the number of background events. The final estimates for different variables and MC prediction coincide within the error.

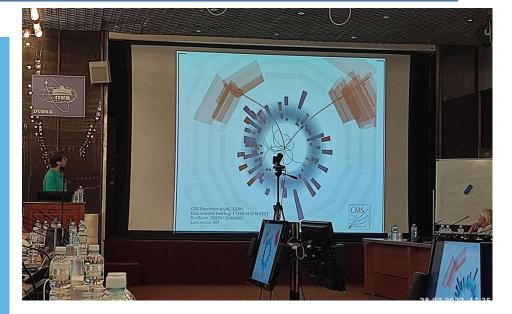
#### References

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#### Contact

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YSF session was devoted to the presentations of participants' scientific results. The report had to be in the form of a brief talk or a poster

The most interesting talks will be published in the peer-reviewed journal

"Bulletin of the Lebedev Physics Institute" indexed by the Web of Science platform.

## Thanks for attention!:)