







### Status of  $\sqrt{s} = 3 TeV$  MDI studies

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# **Detecting Forward Muons**

- **Instrumenting the nozzle**:
	- Small detector
	- High dose from BIB
- **Analysis** approach:
	- Three scoring layers implemented in FLUKA
	- Simulation of Forward Muons and BIB
	- Identification of Forward Muons candidate



- The goal is to **evaluate**:
	- % forward muon tagged
	- # fake forward muon from BIB



# **Detecting Forward Muons**

- **· Instrumenting Nozzles**
- $\mu^+ \mu^-$  →  $ZZ + \mu^+ \mu^-$  → H +  $\mu^+ \mu^-$  →  $W^+W^- + \mu^+\mu^-$
- **Readout window**  $\pm 100$  **ps w.r.t. bunch crossing**
- **Rough tracking of muons in layers (100%** efficiency)







## **Measuring Fo[rward Muons](#page-17-0) Energy**

- Not feasible with track-like detector
- **Energy deposit detector in the cavern** only way







# **Nozzle Geometry Optimization**

### ▪ **Goal:**

- Reduced the BIB flux entering the detector area
- Maximizing the detector acceptance
- **Approaches:**
	- Manual tuning with **high statistics**  simulation
	- Many **low statistics** simulation to train Machine Learning algorithms
	- Bayesian optimization iterating *medium* **statistics** simulation





# **Machine Learning results**

**Method:** 

- Nozzle geometry described by 8 parameters
- $\sim$  13000 FLUKA simulation performed considering 0.02% of a bunch crossing varying the parameters
- Several ML model trained and data transformation techniques applied
- Models evaluated according to  $\Delta[\%] = \frac{Flux_{true} Flux_{predicted}}{Flux_{true}}$  $Flux_{true}$ ∗ 100
- **Goal:**
	- Using a ML model to perform large amount of pseudo-simulation
- **Results:**
	- XGBoost regressor + Standard Scaling is the best model
	- Gaussian fit of  $\Delta$  distribution results in:  $\overline{\Delta} = -0.12\%$ ,  $\sigma = 5.24\%$





# **Bayesian Optimization Results**

### **Bayesian Optimization Loop:**

- Loop that builds a probabilistic model based on past evaluation during each iteration
- Model makes an educated guess on where the best solution is in the parameters phase-space
- **Application to Nozzle optimization:**
	- Loop with 126 iteration, simulating with FLUKA 0.06% of a bunch crossing, varying 8 geometrical parameters
	- Flux of particles entering in the detector area used as metric
- **The algorithm did not converge to an optimal solution** 
	- Low statistics could be the cause





# **Optimized Geometry**

- Considering both Manual Tuning and Machine Learning studies a new design has been achieved
- **Main features:**
	- Base radius reduced
	- Nozzle body further reduced starting at 450 cm from the IP
	- Borated polyethylene coat moved under a layer of tungsten
	- Tip moved few millimeters further from the IP





# **Optimized Geometry**

### ▪ **Beam-Induced Background:**

- Reduced photon and  $e^+/e^-$  flux
- Reduced occupancy in the tracking system
- Increased neutron flux
- **Overall consideration:**
	- Easier to sustain
	- Less material needed
	- Increased detector acceptance
	- BIB impact on tracking system and ECAL reduced
	- BIB impact on HCAL increased





## **Complex observable**

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بعديد

$$
flux \rightarrow a \cdot \frac{\Delta flux_{\gamma}}{flux_{ref_{\gamma}}} + b \cdot \frac{\Delta flux_{n}}{flux_{ref_{n}}} + c \cdot \frac{\Delta flux_{e}}{flux_{ref_{e}}} + d \cdot \frac{\Delta V}{V_{ref}}
$$

### ▪ **Method:**

 $\blacksquare$  a, b, c: Plot sub-detector specific metric as function of BIB flux

(Energy resolution in CALs, occupancy in vertex)

 $\blacksquare$   $\boldsymbol{d}$ : Takes into account costs and acceptance gain. No idea on

how quantify in relation to the other parameters **yet**.





Minternational<br>Collaboration

### *Thank you for the attention*



### **References**

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# **BIB simulation with FLUKA**



- **Generated one beam of**  $\mu^+$  **decays within 55**  $m$  **from the** Interaction Point
- **Energy threshold** for particles production fixed at  $100 \text{ } keV$
- Particles which arrives to the nozzles are scored
- Propagation through the Nozzles
- Particles who exit the nozzle and enters the detector
	- area are scored
- $\sim$  1.6% of one BIB event (i.e. bunch crossing) considering

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only 1 beam  $\rightarrow$  4 *days* per simulation



# **Muon decay position**





## **BIB simulation with FLUKA**









- ◆ 60 layers of 19-mm steel absorber + plastic scintillating tiles;
- $\triangleleft$  30x30 mm<sup>2</sup> cell size;
- $\rightarrow 7.5 \lambda_{L}$

#### electromagnetic calorimeter

- $\triangle$  40 layers of 1.9-mm W absorber + silicon pad sensors;
- $\rightarrow$  5x5 mm<sup>2</sup> cell granularity;
- $\rightarrow$  22  $X_0 + 1 \lambda_1$ .

#### muon detectors

- ◆ 7-barrel, 6-endcap RPC layers interleaved in the magnet's iron yoke;
- $\triangle$  30x30 mm<sup>2</sup> cell size.

### **Detector**



#### superconducting solenoid (3.57T)

#### tracking system

- ◆ Vertex Detector:
	- double-sensor lavers (4 barrel cylinders and 4+4 endcap disks);
	- 25x25  $\mu$ m<sup>2</sup> pixel Si sensors.
- ♦ Inner Tracker:
	- 3 barrel layers and 7+7 endcap disks;
	- $\cdot$  50 µm x 1 mm macropixel Si sensors.
- ♦ Outer Tracker:
	- 3 barrel layers and 4+4 endcap disks;
	- $\cdot$  50 µm x 10 mm microstrip Si sensors.

#### shielding nozzles

Tungsten cones + borated polyethylene cladding.

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### **Forward Muon in Nozzle**







## **BIB characteristics**

**•** By requiring a window of  $\pm 100 \, ps$  with respect to the expected time of arrival in the layers

BIB reduced by 5 order of magnitudes





## **BIB characteristics**

**• BIB particles passing through the layers within the time window (1.4% of b.c)** 





## (a rough) **Tracking**

**EXE** Assuming that forward muons are

produced at the IP, a straight line

is the defined for each point in

layer 1

- The line is propagated to layer 2 and 3. If at least 1 particle is present in the expected position
	- $\pm$  1 *cm*, the particle is tagged as a forward muon





# **Machine Learning results**

### ▪ **Limits:**

- Fixed value of parameters
- Each sample is a different combination on fixed parameters

### ▪ **Next Steps:**

- 9th parameters considered
- All independent values in a defined range
- 20000 simulation





# **Hard ML results**

**EXEC** Feature Importance with XGBoost regressor





# **Bayesian Optimization Results**

### ▪ **Next steps:**

- 9 parameter simulation
- High statistics used (1.6 % of bunch crossing)
- It will take about 2 month





## **High Statistics Approach**

- **E** Lessons learned:
	- **The Beam Pipe cannot be touched**
	- **E** Is Boreth layer really effective?
		- **Timed to put the Boreth inside the nozzle**









# **Optimized Geometry**

- **Real tungsten alloy simulated:**
	- Same spectra
	- 9% more particles









## **Low Statistic simulation**



- $\blacksquare$  Two step: 2% of one beam, one bunch crossing
- **Pipeline: 0.025% of one beam,** one bunch crossing
- **Pipeline nozzles smaller** than

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original (aperture = 20 cm)

 $\sigma = \sqrt{\text{\#particles}}$ 



# **ML Studies**

- 2\*1200 simulation performed with minimum beampipe radius 0.3 (original) and 0.35
- **B** 3 geometrical parameters:
	- $\theta_{tip} \in [3.8; 10]$ <sup>o</sup>  $\rightarrow$  10 values
	- $|z_{change}| \in [50; 200]$  cm
		- $\rightarrow$  15 values
	- $r_{base} \in [20, 60]$  cm  $\rightarrow$  8 values
- 0.02% of 1 bunch crossing simulated
- Due to input settings, the real nozzle aperture is  $\rightarrow$

 ℎ 

$$
\theta_{nozzle} = \tan^{-1} \left[ \frac{(94 \cdot \tan \theta_{tip}) \cdot r_{base} / 60}{|z_{change}| - 2} \right] \in [0.7; 18]^\circ
$$





# **Incoherent Pair Production**

**E** Another source of background due to beam-

beam interaction

- **Produced the**  $e^{\pm}$  **pairs with GUINEAPIG**
- **Products propagated in FLUKA as for two** Step Simulation
- **Reconstruction in the tracking system**
- **E** Slightly increase in occupancy (about 5%)





## **Improving the ML**

New Nozzle Prototype



 $z$  [cm]

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## **Improving the ML - 2**

New Nozzle Prototype

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**Two new parameters:** 

- $z_{tip} \in [-8, -4]$  cm
- $r_{tip} \in [0.6; 1.4]$  cm
- 2187 samples (3 values per each parameter)



### **Nozzle Design XVI**

