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# Neutrino Beam Optimization for the ESSvSB Experiment

 $\label{eq:loris} Loris\ D'Alessi^1$  On behalf of the ESSvSB Collaboration

<sup>1</sup>IPHC, Université de Strasbourg, CNRS/IN2P3, Strasbourg, France

loris.dalessi@iphc.cnrs.fr



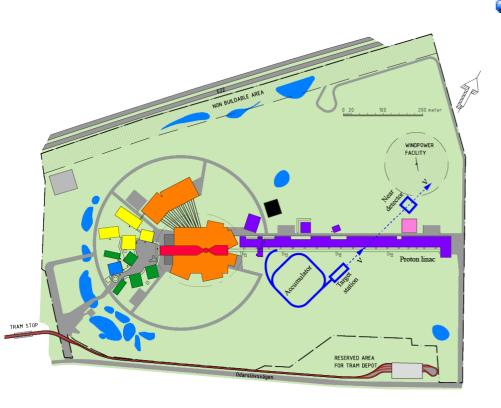
IRN Neutrino

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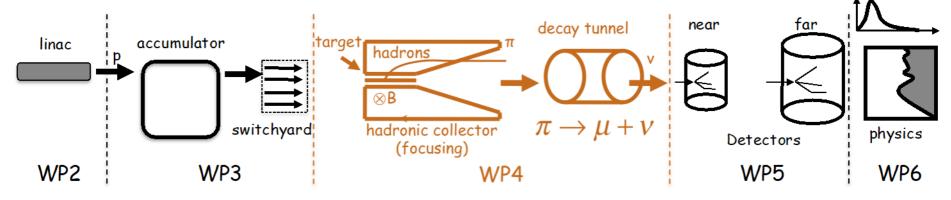
### The ESSvSB Project





ESSvSB is a project, currently in a Design Study phase funded by EU-H2020, which aims at the production of an intense neutrino beam by using the ESS linac, under construction in Lund (Sweden).

- Upgrading of the linac for an additional 5 MW, 14 Hz rep rate, 2.5 GeV proton beam, with  $\sim 1.5 \ \mu s$  pulse duration at the level of the target station.
- High precision measurement of CP violating neutrino oscillation phase  $\delta_{CP}$ .



#### 11.06.2021

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[1] E. Baussan et al., Nucl. Phys. B, 885:127-149 (2014)

[2] M. Dracos et al., PoS, NuFact2019:024 (2020)

### The ESSvSB Project



5000

4000

Events 0000

2000

1000

1.0

 $\delta = -\pi/2$ 

 $\delta = 0$ 

 $\delta = \pi/2$ 

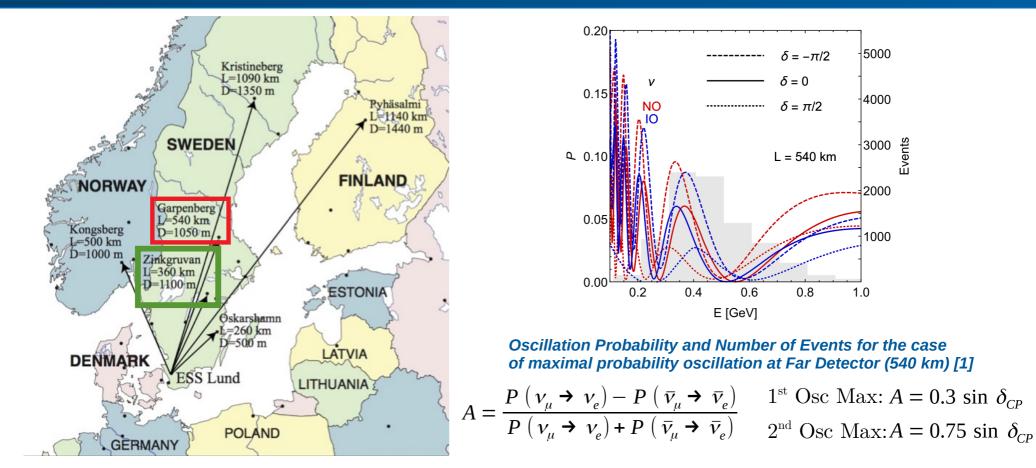
L = 540 km

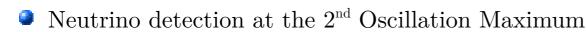
0.8

0.6

E [GeV]

0.4





- Less statistics than 1<sup>st</sup> oscillation maximum, but less contribution from systematics.
- 2 locations under consideration: Garpenberg (current baseline) and Zinkgruvan.
- Statistics achievable from the neutrino beam is therefore a key ingredient of the experiment.

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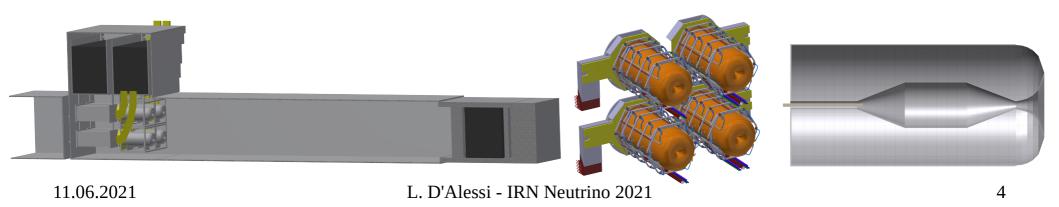
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#### **References:**

[1] M. Blennow et al., Eur. Phys. J. C80:190 (2020)



- Main components of the Target Station:
  - 4 target/horn system for hadron production/collection.
    - Each target consists of a packed bed of titanium spheres. The total radius and length of the proposed target is 1.5 cm and 78 cm, respectively.
    - Each horn has a MiniBooNE-like shape of about 60 cm radius and 2.5 m length each, in the current baseline.
    - The magnetic field is generated by a 350 kA half sinusoidal current pulse in the horn.
  - Pions produced and collected are let to decay in flight in a decay tunnel (4 m x 4 m x 25 m).
  - The hadrons and muons are then absorbed by a beam dump at the end of the decay tunnel.



#### The Genetic Algorithm as Optimization Technique for the ESSvSB Neutrino Beam

- A Genetic Algorithm driven optimization has been developed for the design of the ESSvSB target station
  [1].
- The software used for the Genetic Algorithm calculations is the Python toolkit DEAP [2].
- The Genetic Algorithm (GA) optimization method has been already used for the design of other neutrino beam experiments, such as LBNO [3] and DUNE [4].
- In this work, different realizations of the 4 target/horn system and decay tunnel are produced and let to evolve by using the Genetic Algorithm to find the optimal configuration.
  - The neutrino flux is obtained with a FLUKA [5] code with a simplified geometry of the target station consisting of the 4 target/horn system and the decay tunnel.
  - The neutrino fluxes are used to calculate with GloBES [6] the fraction of range of  $\delta_{CP}$  values which can be reached at 5 $\sigma$  C.L.. This represents the FoM of our system.
  - At a given generation, after which no significant improvements in the optimization procedure are observed, the configuration with the maximum of fraction of  $\delta_{\rm CP}$  values covered is considered as the optimal configuration.

#### **References:**

- [1] L. D'Alessi *et al.* [ESSvSB], "Optimization of the Target Station for the ESSvSB Project Using the Genetic Algorithm", NeuTel Conference 2021.
- [2] F. Fortin, F.-M. De Rainville, M.-A. Gardner, M. Parizeau, C. Gagné, Journal of Machine Learning Research, 13:2171-2175 (2012).
- [3] M. Calviani, S. Di Luise, V. Galymov, and P. Velten, Nucl. Part. Phys. Proc., 273-275:2681–2683 (2016).
- [4] R. Acciarri et al., FERMILAB-DESIGN-2016-02, arXiv: 1512.06148 [physics.ins-det] (2016).

<sup>[5]</sup> A. Ferrari, P. R. Sala, A. Fasso, and J. Ranflt, FLUKA: a multi-particle transport code, CERN-2005-10 (2005), INFN-TC-05-11, SLAC-R-773, V. Vlachoudis, FLAIR: A Powerful But User Friendly Graphical Interface For FLUKA, in Proc. Int. Conf. on Mathematics, Computational Methods & Reactor Physics (M&C 2009), Saratoga Springs, New York, 2009.

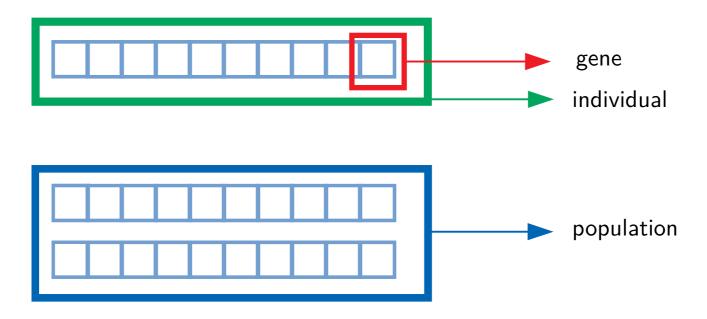
<sup>[6]</sup> P. Huber et al, Comput. Phys.Commun. 167 195 (2005) [arXiv:hep-ph/0407333], P. Huber et al, Comput. Phys. Commun. 177432–438 (2007) [arXiv:hep-ph/0701187].



- The Genetic Algorithm (GA) is a method for optimization studies based on evolutionary algorithms and it is inspired by the processes of natural selection.
  - The goal of the GA is to find a set of parameters of a system for which the value of a given Figure of Merit (FoM) is optimal.

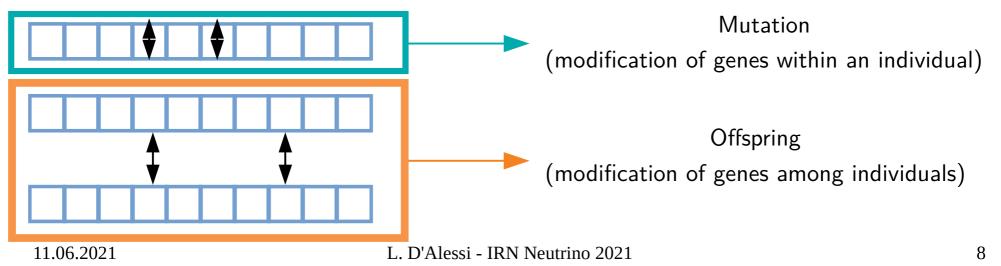


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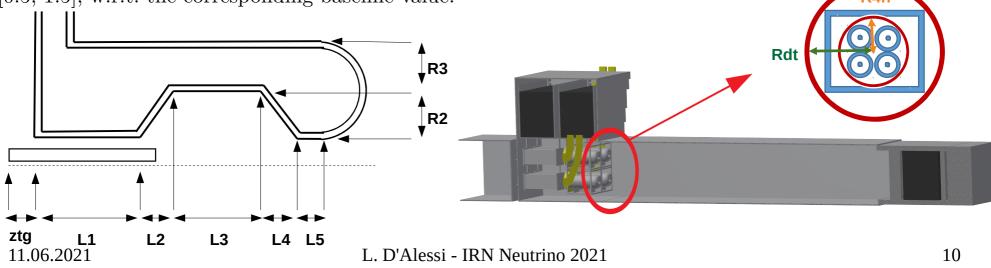




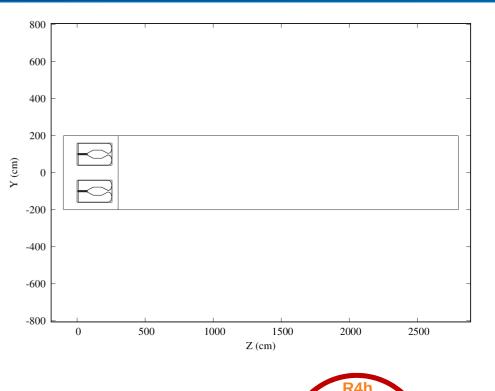
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- The set of the modified individuals and unmodified ones represents the population of the next **generation**.
  - Only individuals with best fit values are kept for the population of the next generation.

### The Genetic Algorithm Applied to the Design of the Target Station Components

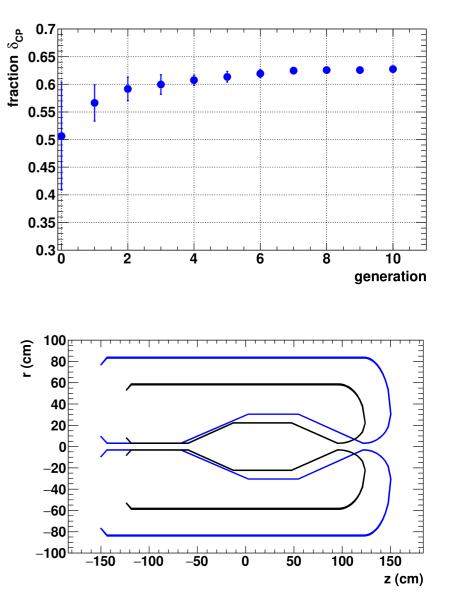
- The starting point of the Genetic Algorithm (GA) applied to the ESSvSB experiment is the current baseline of the Magnetic Horn (MH) and Decay Tunnel (DT) geometry.
- For our work, the following parameters of the horn and decay tunnel have been considered:
  - L1, L2, L3, L4, R2, R3, ztg, Ldt (Length of Decay Tunnel).
  - The radius of the Decay tunnel is calculated so that the ratio Rdt/R4h is constant.
- The value of the i-th parameter has been rescaled by a scale factor, which value is included in the range [0.5, 1.5], w.r.t. the corresponding baseline value.







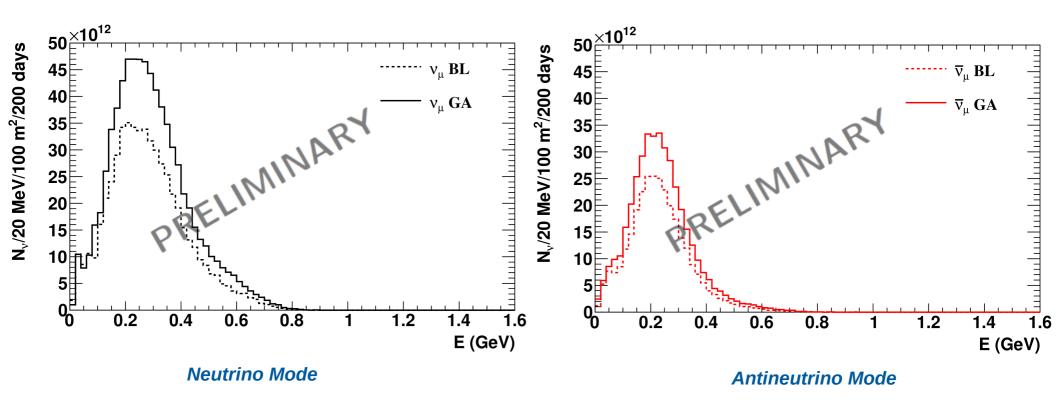
- The code converges already after few generations.
  - For the optimization of this system, the convergence refers more on the evolution to a populations in which many individuals tends to have same performance (the std calculated on the population is smaller).
- According to our results, a larger shape of the horn (with fine tuning of the parameters of the inner region of the horn) is preferred.
- The results showed also that the GA tends to prefer longer decay tunnel lengths.



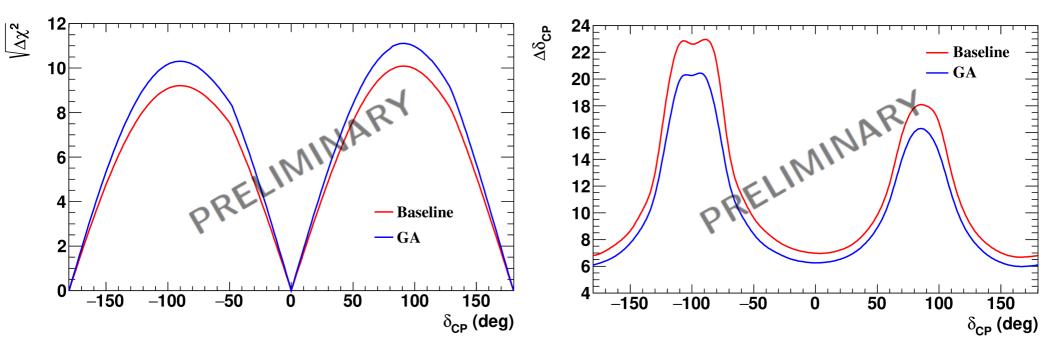




As a first consequence of the performance of the new 4horn/decay tunnel system, the statistics in the right sign neutrinos is improved.



- Furthermore, the sensitivity results improved as well.
- $\bigcirc$  Results here shown refers to the neutrinos detected at 540 km (Garpenberg)
  - NH, SO
  - Systematic errors on signal/background: 5/10% .
- Further details in future publications.



## Conclusions



- The Genetic Algorithm provides a powerful tool to scan the parameter space for the optimized design of the target station components.
- The code shows fast convergence and the optimized geometry of the hadron collector and decay tunnel provides enhanced Physics performance of the experiment.
- Studies are currently on going to determine the feasibility of the horn geometry suggested by the optimization study, from the mechanical point of view.
- Soon results will be published on the improved sensitivity of the ESSvSB experiment.

#### Acknowledgement

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### **Thank You for Your Attention!**