## GEANT4, A LONG JOURNEY TO FUTURE

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<u>Material and input by</u> G. Bartolini, B. Caccia, G.A.P. Cirrone, F. Farokhi, S. Fattori, C. Mancini Terracciano, G. Milluzzo, G. Paternò, G. Petringa, I. Postuma, S. Pozzi, F. Romano, A. Sciuto, A. Sytov

Computing@CSN5: applications and innovations at INFN Bari, October 14<sup>th</sup>-16<sup>th</sup> 2024

# **INTRO & HISTORY**

#### Introduction

- Monte Carlo simulation of the interaction of ionizing radiation with matter key ingredient for all particle and nuclear physics experiments
  - ... and astroparticle, space, medical, applied physics, ...
- Highly transversal need within all INFN communities
- Used both for the design/optimization of experiments and for the data analysis phase
- Must feature:
  - Reliable physics models  $\rightarrow$  key!
    - At least in a specific energy range and for a set of particles
  - Capability to handle complex geometries («navigation»)
  - Computational efficiency («be fast»)

## A little bit of history... R&D to Geant4

- A new toolkit for the simulation of the interaction of particles with matter, meant to be the successor of the FORTRAN-based Geant3
  - CERN product, widely used in the '90
- Start as R&D project (RD44) at CERN (1994-1998)
  - Definition of the basic strategy and design
  - Initiated for HEP, but with a broader perspective since the beginning

SCP

- Geant4.0.0 Production Release in December 1998
- Main aspects/novelties:
  - Written in C++ language
    - Takes advantage from the Object Oriented software technology
    - Easy to extend
  - Open source

CERN-LHCC-97-40

EUROPEAN ORGANIZATION FOR NUCLEAR RESEARCH

CERN/LHCC/97-40 LCB Status Report / RD44 10 June 1997

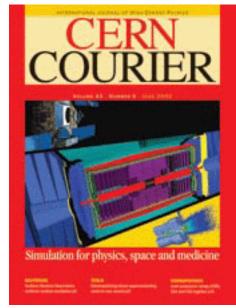
#### GEANT4: An Object-Oriented Toolkit for Simulation in HEP

T.Wenaus BNL Brookhaven National Laboratory, USA (STAR) J.Apostolakis, A.Dell'Acqua, G.Folger, S.Giani (spokesman), N.Hoimyr, A.Osborne, S.Prior, P.Urban CERN – Geneva, Switzerland

## The Geant4 Collaboration! Geant 4

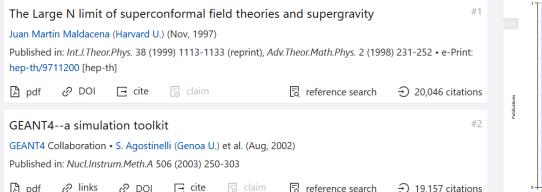


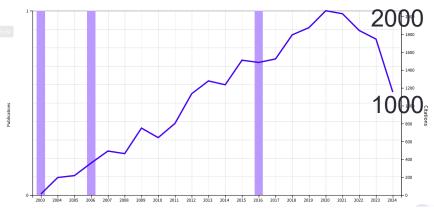
- International Geant4 Collaboration born in 1998
  - Approximately 100 members, from Europe, America and Asia
  - Last week, 29<sup>th</sup> Collaboration Meeting (hosted in Catania)
- Regulated by its own MoU, with spokesman and other boards
  - Current spokesman: Alberto Ribon (CERN), 2-year terms
- **INFN** in the game since the very beginning, with a leading role
- Effective organization in working groups
- Takes care of software production and management
  - Regularly, two releases per year since >20 years (+ patches)
  - Examples released with the kernel  $\rightarrow$  many domains, including applied physics
- Last version: Geant4 11.2.p02 (Jun 21<sup>st</sup>, 2024)



#### Story of a success...

- Geant4 immediately recognized and adopted in many different domains
  - All «big four» at LHC, but also many experiments/projects
  - Significant use in medical physics (Geant4-DNA, several wrappers, ...)
- Three papers, highly cited
  - S. Agostinelli et al., NIM A 506 (2003) 250 → 17.5k
  - J. Allison et al., IEEE TNS 53 (2006) 270  $\rightarrow$  4.7k
  - J. Allison et al., NIM A 835 (2016) 186 → 2.3k
  - Growing at >1300 citations/yr
- The main Geant4 paper is the 2<sup>nd</sup> most cited paper in INSPIRES

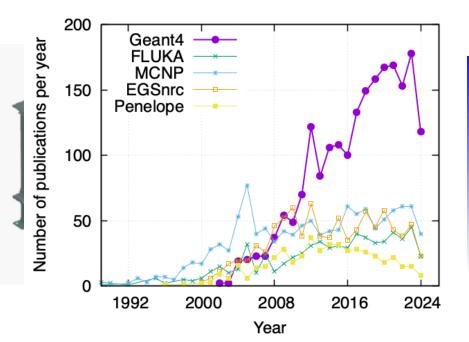


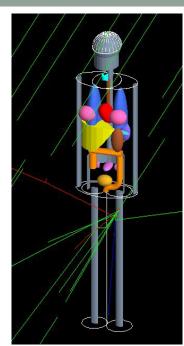


### ... in many different fields

- Open source + general purpose + flexible for extensions → rapid diffusion to *different domains*
  - Underground/lowenergy, medical, space, nuclear, …
- Other important drivers:
  - Active communities represented in the Collaboration
  - Availability of (maintained) examples
- Highly transversal product: of interest for most experiments accross all CNSs of INFN
  - Users in applied physics
- Technology transfer → use in non-academic application
  - Contribution from INFN

Talk by G. Bartolini





### The Geant4 Collaboration

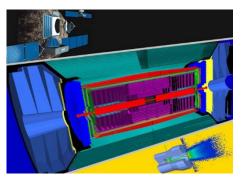


- Definitely a very successful product
- Many things changed in >25 years of operation
  - Logo, website, spokesman & coordinators
  - People grew older (and some retired)
- Participation by INFN always significant
  - Currently, three Steering Board Members

C. Mancini, F. Romano, A. Sytov



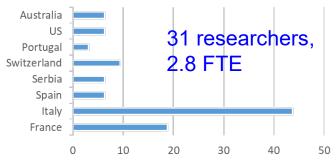


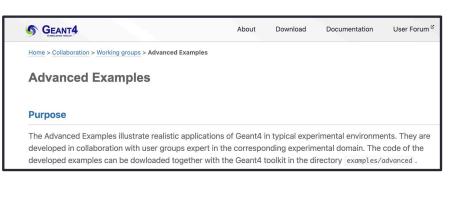


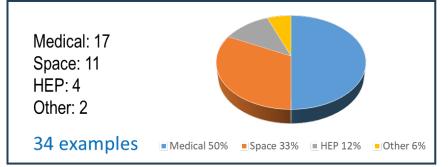
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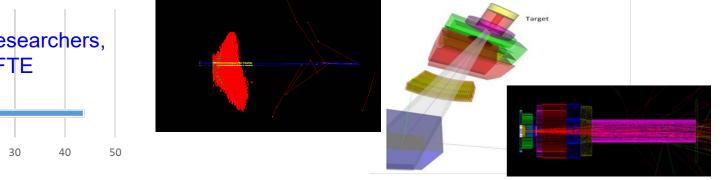
#### Geant4 advanced examples

- End-to-end Geant4 realistic applications in typical experimental environments
  - Strong link with experimental groups → ground for validation!
- Many different domains covered (esp. medical & space)
- Strong involvement of INFN groups since the beginning







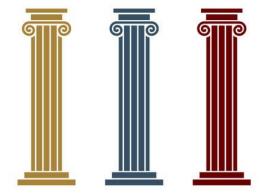


https://geant4.web.cern.ch/collaboration/working\_groups/advExamples/

## WHAT NOW?

#### What's still to be done in Geant4?

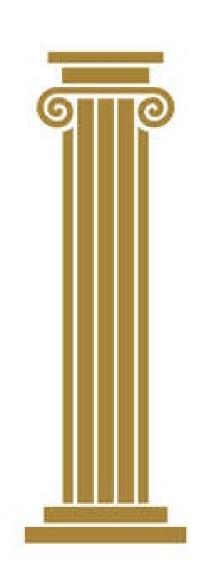
- The *«roaring years»* and the fast developments of the early 2000's are passed
- Now very stable and mature product
  - Most releases are «minor»: no change in the user interfaces
- Three key pillars
  - Development of new physics models
  - Validation
  - Use of novel IT technologies ( $\rightarrow$  fast development)



**GEANT** 

- Critical to have an effective coordination of the INFN efforts
  within the Geant4 Collaboration
  - Project Geant4INFN in CSN5
  - Valorize and maximize the global contribution by INFN
  - Join different communities and provide INFN-wide support

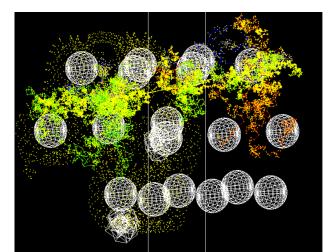
# NEW MODELS



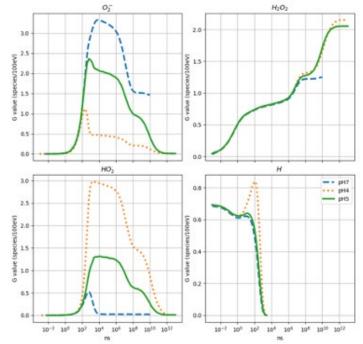
#### **Geant4-DNA**



- Simulate interactions at low-energy in biological materials
  - Follow the physico-chemical and chemical phases
  - Reproduce quantitatively cellular damage processes
- Detailed simulation (not condensed) → CPU-intensive
- In some phases, have to account for secondaries mutualinteraction and chemical equilibrium
- Field of very active development
- Validation is critical  $\rightarrow$  requires data

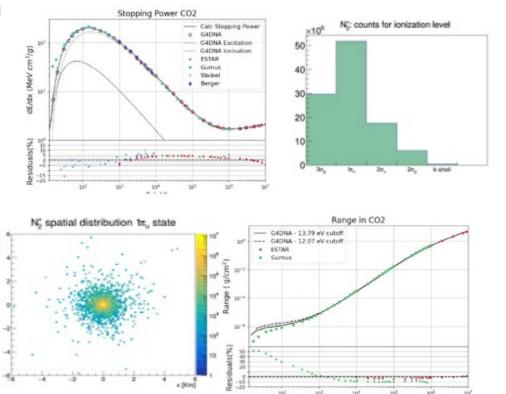


#	Equilibrium	рКа
1	$\rm 2H_2O \longleftrightarrow OH^- + H_3O^+$	13.999
2	$\mathrm{H_2O_2} + \mathrm{H_2O} \longleftrightarrow \mathrm{HO_2^-} + \mathrm{H_3O^+}$	11.65
3	$^{\circ}\mathrm{OH} + \mathrm{H_{2}O} \longleftrightarrow \mathrm{O^{-}} + \mathrm{H_{3}O^{+}}$	11.9
4	$\mathrm{HO}_2 + \mathrm{H}_2\mathrm{O} \longleftrightarrow \mathrm{O}_2^- + \mathrm{H}_3\mathrm{O}^+$	4.57
5	$H + H_2 O \Longleftrightarrow e^{-}_{aq} + H_3 O^+$	9.77



#### Geant4-DNA extension for atmosphere

- Important item from climatology
  - Cosmic rays are the main source of atmosphere ionisation
  - No MC simulation able to predict ionisation of the medium
- Cross sections for e- impact on N<sub>2</sub>, O<sub>2</sub>, CO<sub>2</sub> molecules implemented in Geant4-DNA
  - Energy range: 10eV 10MeV
  - Being extended to positrons
- Three physics models:
  - Elastic scattering, Ionization, Excitation
- Check of ranges and stopping powers vs. NIST
- Dissociation process included through the dissociation branching ratios
  - Subsequent verification is still needed



Model details: F. Nicolanti, et al, Phys Med. 2023 Sep 11;114:102661. Model implementations: F. Nicolanti, et al, Accepted by Phys Med. (2024)

E (eV)

GFANT4

## Interaction in crystalline materials



• In collaboration with **project Trillion** (Marie Curie Action)



Steering and radiation effects in oriented crystals and their applications implementation into Geant4

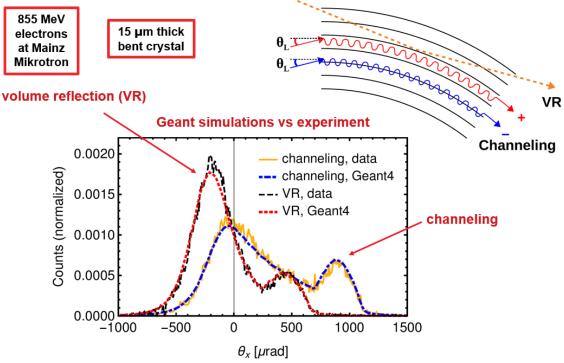
- Implementation of electromagnetic processes in oriented crystals
- Specific applications of crystalline effects into Geant4 as extended examples
- Beam deflection by a bent crystal
- Model and one example already released

Main goals:

• More to come in the next release (3 examples)

A.Sytov et al. J. Korean Phys. Soc. 83 (2023) 132A.Sytov et al. Eur. Phys. J. C 82 (2022) 197

https://www.fe.infn.it/trillion/





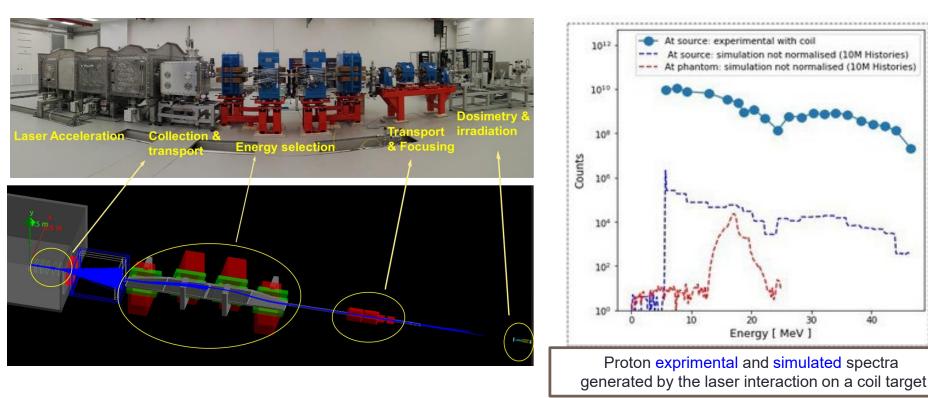
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#### Laser-driven acceleration





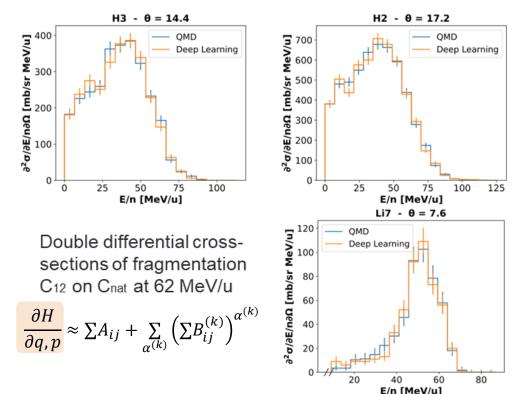
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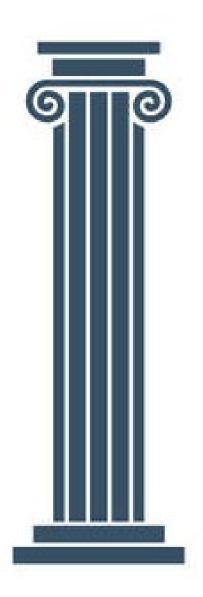
- Goal#1: reproduce the outcome from a laser-driven acceleration beamline
- Long-term: start to use Geant4 to simulate laser-plasma interactions
  - At least in some specific regions of the phase space

## Hybrid nuclear interaction models

- Accurate models to describe nucleus-nucleus interactions at low energy are very slow
  - Project GENIALE as «Grant Giovani» fellowship of CSN5
- Exploring the possibility of accelerating portion of the model by developing a physics-informed neural network
- QMD as a benchmark (possible to apply to LiQMD and BLOB)
- Emulating the derivative of the hamiltonian with respect to the generalised coordinates
- Excellent agreement with (very slow) MC

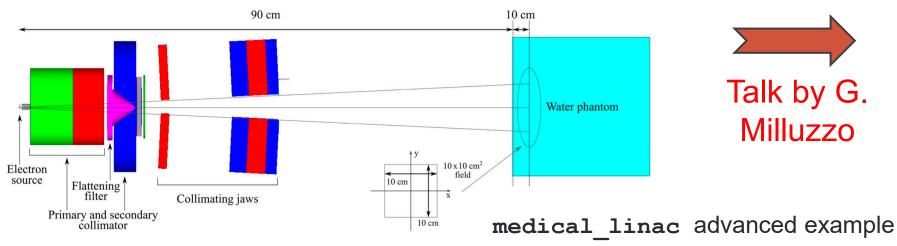


# VALIDATION



#### Medical physics validation (G4Med)

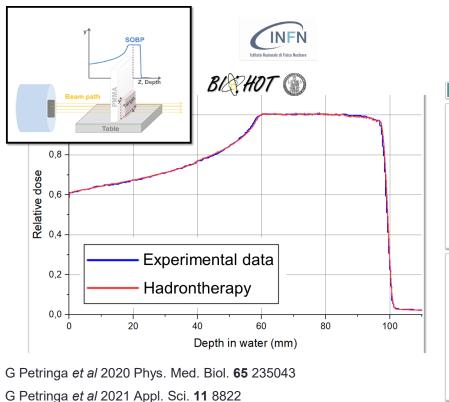
- General project to benchmark Geant4 for many use cases of medical interest
   P. Arce et al, Med. Phys.
- One paper published, one submitted
- Evaluation of the combination of physics model of Geant4 which is better suited to reproduce the experimental data
  - Different application may require different physics lists
- Several tests/benchmarks under the INFN responsibility
  - E.g. MV X-ray Radiotherapy, validation against EURADOS data

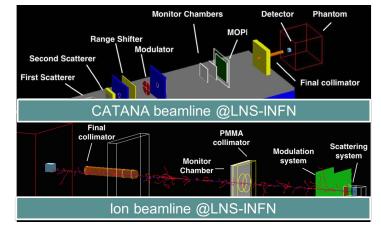


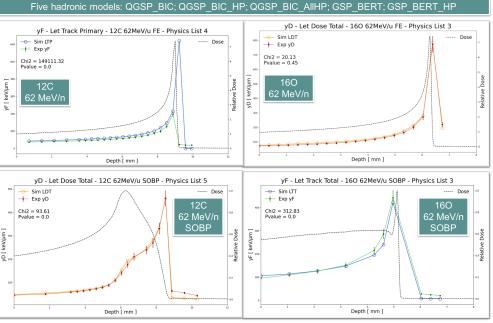
48 (2021) 19

#### Validation of LET and doses with ion beams

- Advanced example hadrontherapy
- Multi-purpose for several hadrontherapy beamlines
- LET and dose space distributions







S Fattori *et al* 2022 Phys. Med. Biol **67** 165003

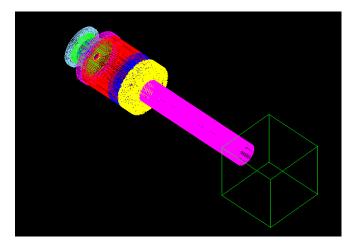
## eFLASH therapy





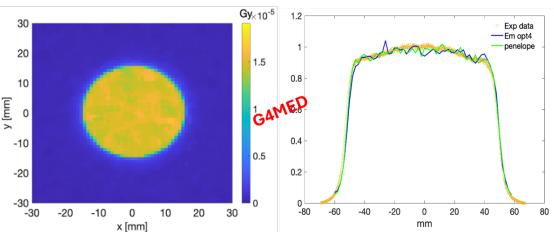








- Dedicated advanced example
  eFLASH radiotherapy
  - Released in Dec 2022
- Simulation of the ElectronFLASH LINAC installed at the Centro Pisano for FLASH Radiotherapy
  - Manufacturers' specifications (Sordina lort Technologies S.p.A)
- Used for validation and benchmarking within G4Med (dose distributions)



INFN

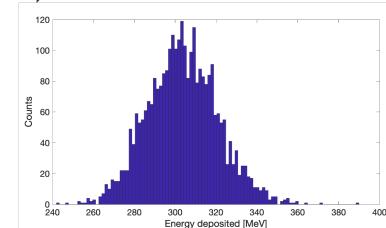
GEANT

### Microdosimetry

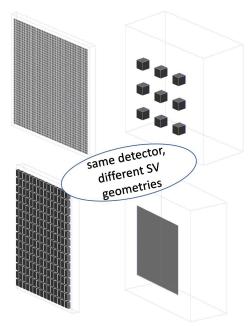




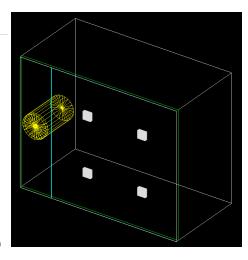
- Recently extended to clinical microdosimetric applications (proton and ion therapy)
- General-purpose versatile example exp\_microdosimetry for the simulation of several microdosimeters:
  - Silicon, Diamond
  - TEPC (in progress)
  - SiC (in progress, see next slide)
- Several functionalities
  - Simulation of doublestage geometries for particle identification
- Usable immediately for validation



Talk by G. Milluzzo



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mental calibration and corresponding f

Calibration data

### Microdosimetry with SiC detectors

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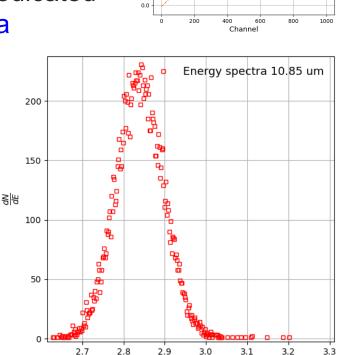
3.0

Energy [ MeV ]

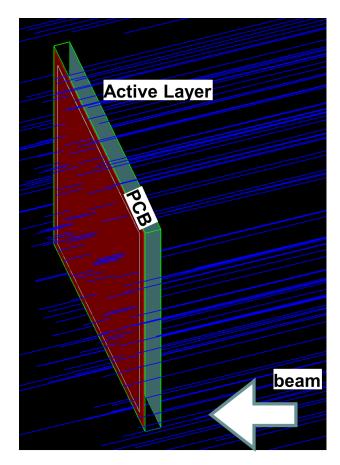
1.0

0.5

- Dedicated application for a SiC microdosimeter
  - Validation of the simulation with dedicated experimental data
- Real detector geometry implemented
  - Passive layers, active layer, electrical contacts...

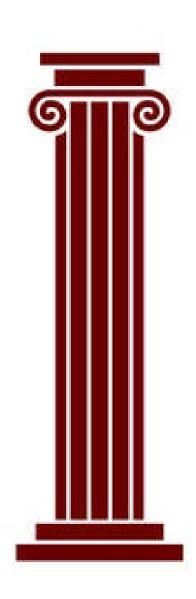


Energy [MeV]



V Conte et al 2020 Phys. Med. Biol. 65 245018

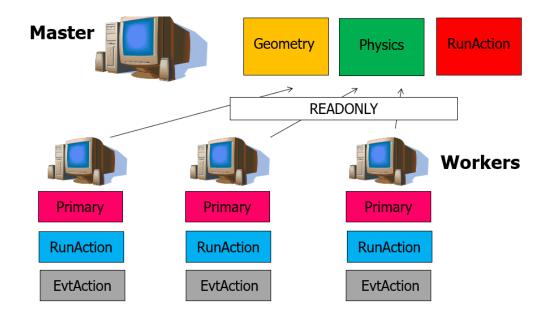
# NEW IT TECHNOLOGIES



#### Catch up with new technologies

#### • Rapid evolution in IT technologies (hardware and software)

- Tools that are «normal» now did not exist in 1998, when the design of Geant4 was worked out and frozen
- Multi-threading, deep learning, git, cloud, ...
- Geant4 was initially meant to run in «sequential» mode only
  → parallelization (GRID paradigm)
- Major upgrade to accommodate for multithreading
  - Available since Geant4 10.0 (Dec 2013)
  - Share events to simulate among different threads
  - Invasive changes, painful



#### **Running Geant4 on GPUs**

- The particle tracking simulation not very suitable for GPU implementation (→ parallel tracking)
  - Very successful for optical photons (JUNO) and Geant4-DNA (especially for physico-chemical and chemical stages)

#### Several demonstrators available or being developed

#### J Phys. Conf. Ser. 2438 (2023) 012078

Deferred Optical Photon simulation for the JUNO experiment

Tao Lin (on behalf of the JUNO collaboration) Institute of High Energy Physics, Chinese Academy of Sciences, Beijing 100049, China

#### AdePT and Celeritas:

- Demonstrators for a full-scale realistic HEP applications (test beams, etc.)
- EM part (e<sup>±</sup>, γ) offloaded to GPU
- Results compatible with CPU runs
- Geant4 internal «delta» assessment panel in place

Med. Phys. 46 (2019) 1483

MPEXS-DNA, a new GPU-based Monte Carlo simulator for track structures and radiation chemistry at subcellular scale

Shogo Okada<sup>a)</sup> and Koichi Murakami KEK, 1-1, Oho, Tsukuba, Ibaraki 305-0801, Japan

Sebastien Incerti University of Bordeaux CENBG UMR 5797, Gradignan F-33170, France CNRS IN2P3 CENBG UMR 5797, Gradignan F-33170, France

Katsuya Amako and Takashi Sasaki KEK, 1-1, Oho, Tsukuba, Ibaraki 305-0801, Japan

(Received 29 July 2018; revised 17 December 2018; accepted for publication 19 December 2018;

#### J Phys. Conf. Ser. 2438 (2023) 012055

Offloading electromagnetic shower transport to GPUs

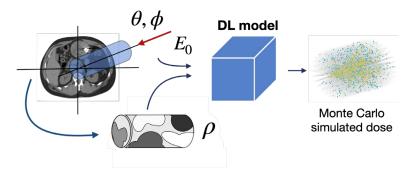
G Amadio<sup>1</sup>, J Apostolakis<sup>1</sup>, P Buncic<sup>1</sup>, G Cosmo<sup>1</sup>, D Dosaru<sup>2</sup>, A Gheata<sup>1</sup>, S Hageboeck<sup>1</sup>, J Hahnfeld<sup>1</sup>, M Hodgkinson<sup>3</sup>, B Morgan<sup>4</sup>, M Novak<sup>1</sup>, A A Petre<sup>5,6</sup>, W Pokorski<sup>1</sup>, A Ribon<sup>1</sup>, G A Stewart<sup>1</sup> and P M Vila<sup>1</sup>

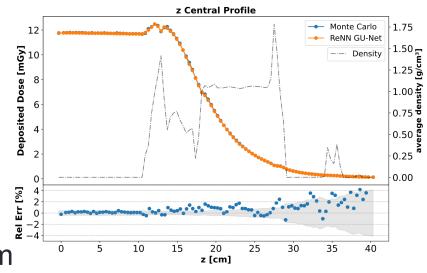
#### EPJ Web of Conf. **295** (2024) 11005 Celeritas: accelerating Geant4 with GPUs<sup>\*</sup>

Seth R. Johnson<sup>1,\*\*</sup>, Julien Esseiva<sup>4</sup>, Elliott Biondo<sup>1</sup>, Philippe Canal<sup>2</sup>, Marcel Demarteau<sup>1</sup>, Thomas Evans<sup>1</sup>, Soon Yung Jun<sup>2</sup>, Guilherme Lima<sup>2</sup>, Amanda Lund<sup>3</sup>, Paul Romano<sup>3</sup>, and Stefano C. Tognini<sup>1</sup>

### Machine Learning - Emulation

- Speed up CPU-intensive simulations by emulating the result of a simulation by a DL algorithm
  - Simulation used for training
- Deep Learning Dose Engine
- Developed an algorithm to emulate dose deposition as a function of the beam parameters
- **Differentiable** with respect to beam parameters
  - Treatment plan optimization
- Used a Graph Neural Network with a custom pooling technique
- Cylindrical geometry around the beam
- Very good agreement with MC



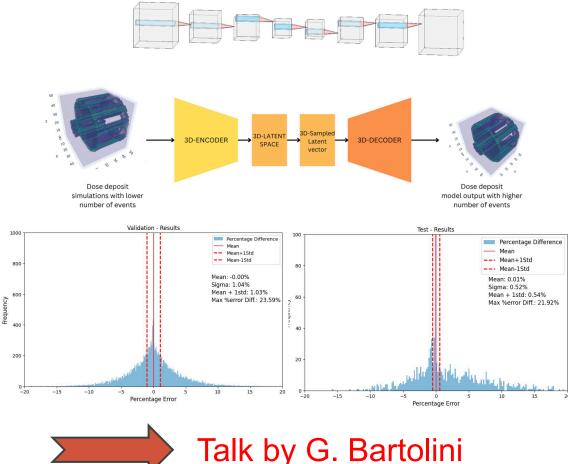


L. Arsini, et al. Algorithms 2023, 16(3)

L. Arsini et al. submitted to Frontiers in Physics 2024)

### Machine Learning - Super Resolution

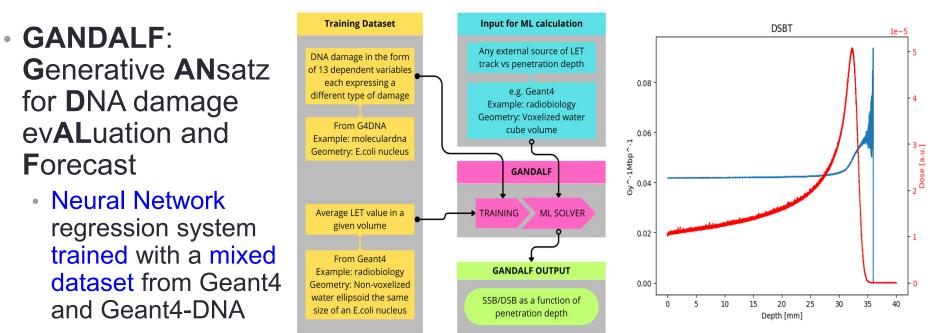
- Use ML to **artificially increase** resolution → **MRADSIM** 
  - Low-stat sample from MC used for the training



- Created model architecture and tested two different models
  - 3D-VAE
  - Random Forest Regressor
- First tests with limited dataset
- Results are not yet optimized
  - Future plans:
    - Increase volume and complexity of training dataset
    - Test with different optimizers, loss functions, and other models
    - Increase the number of number of events to predict (up to 10<sup>12</sup>)

### Multiscale and machine learning

- Evaluation of the SSB/DSB damage by Geant4-DNA models very CPU-intensive
- <u>Idea</u>: bridge the gap! Train ML to emulate this result by using as input the results of a «conventional» (and much faster) Geant4 simulation (dose, LET, RBE, ...)
  - Extended example radiobiology very suitable



#### **Containers and Cloud**

- Pack a fully working Geant4 installation in a container
  - Deployment everywhere, as a docker image
- Use Apptainer (formerly Singularity)
  - Compatible with Docker images



- Largely available on scientific computing clusters
- With a few commands it's possible to run a Geant4 application regardless of the environment (even without installing Geant4)
  - The container is built via GitHub CI and hosted on GitHub itself
- Multiple use-cases:
  - Validation jobs (e.g. split in many locations)  $\rightarrow$  G4val, G4med
  - Training (e.g. Geant4 courses)
  - Cross-platform portability



- Intense activity within INFN for dissemination and training on Geant4
  - Recently extended to Geant4-DNA (dedicated path)
  - Coordinated by Geant4INFN
- Targeting scientific users (PhD, postDocs, ...) in all fields of interest of INFN, but participants also from companies

25-29 nov 2024

Europe/Bucharest fuso orario

Extreme Light Infrastructure - Nuclear Physics (ELI-NP)

- Four courses in 2024
  - XI International Geant4 School (January, Pavia)
    - w/ Geant4-DNA
  - VIEWS Workshop (April, Vienna)
  - Alghero Seminar (June, Alghero)
  - XII International Geant4 School (November, Bucarest)
    - w/ Geant4-DNA







XI International Geant4 School

14-19 Jan 2024

### A quick summary



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- Geant4 is a mature software, widely used in a variety of physics domain of interest for INFN
- INFN strongly involved in the development since the beginning
  - Interesting for applied physics and for technological transfer
- Despite the maturity, quite a lot of activity
  - Development of physics models in innovative domains and directions
    - Geant4-DNA, crystals, laser, N-N
  - Validation and QA/QC, especially in medical physics
    - Strong synergy with experimentalists
  - Efficient use of opportunities by novel IT technologies
- Geant4INFN project in CSN5 acting as the collector of the Geant4 activities within INFN
  - Optimize the global contribution to Geant4 by INFN
  - Offer support (+ training) to the INFN community