An easy tool for the Monte Carlo simulation of the passage of photons and electrons through matter

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Abstract

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A simple Monte Carlo (MC) algorithm for the simulation of the passage of low-energy gamma rays and electrons through any material medium is presented. The algorithm includes several approximations that accelerate the simulation while maintaining reasonably accurate results. Notably, pair production and Bremsstrahlung are ignored, which limits the applicability of the algorithm to low energies (≤ 5 MeV, depending on the medium). Systematic comparisons for both photons and electrons have been made against the MC code PENELOPE and experimental data to validate the algorithm, showing deviations in the deposited energy smaller than or around 10% in the energy interval of $0.1 - 5$ MeV in light media. The simulation is also valid for heavy media, but with less accuracy as a consequence of the abovementioned approximations. Also X-ray fluorescence is ignored leading to some limitations for photons with energies slightly higher than the K-shell. The algorithm has been implemented in an opensource Python package called LegPy, which provides an easy-to-use framework for rapid MC simulations aiming to be useful for applications that do not require the level of detail of available well-established MC programs.

Keywords: Monte Carlo simulation, ionizing radiation

1. Introduction

The study of the interaction of ionizing radiation with matter is of utmost importance in a wide range of applications. Monte Carlo (MC) simulations are extensively used to this purpose, and several excellent MC programs are available, such as EGS4 [\[1\]](#page-8-0), PENELOPE [\[2\]](#page-8-1), GEANT4 [\[3\]](#page-8-2) and MCNP [\[4\]](#page-8-3), to name a few. These programs provide frameworks for detailed simulations of any case of study, including complex geometrical forms and all the physical processes that ionizing particles may undergo in a broad energy range. Moreover, these programs typically offer multiple options for different physical models and corrections due to the specific features of the atomic composition of the media. Unfortunately, such accuracy comes at the cost of increasing technical complexity, which may require users to acquire expertise to obtain meaningful results. Additionally, the more detailed a simulation is, the more time and computing resources it demands, which could limit the use of these programs in some applications. As an alternative, analytical calculations or simple models can be used to obtain estimates of the desired results. However, this approach generally lacks the accuracy and level of detail provided by MC simulations.

In this paper we present a simplified MC algorithm for the simulation of the passage of low-energy (i.e., from about 1 keV up to a few MeV) gamma rays and electrons through any material medium. The algorithm is based on several approximations that enhance simulation speed and simplicity while maintaining reasonably accurate results. In particular, we developed a very simple model for electron transportation that accelerates the simulations significantly. In this work, we analyzed the

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range of validity and assessed the impact of these approximations by comparing them against both experimental data and results from well-established MC programs, especially PENE-LOPE [\[2\]](#page-8-1). We implemented the algorithm in a Python package called LegPy, released under an open-source license [\[6\]](#page-8-4). This tool aims to provide a generic and easy-to-use framework for rapid simulations in applications where minor details are not necessary.

The paper is structured as follows. In section [2,](#page-0-0) the physical approximations employed in our MC algorithm and the main features of the package LegPy are described. The validation of the algorithm is presented in section [3.](#page-2-0) Lastly, in section [4,](#page-7-0) the conclusions drawn, the potential uses of our algorithm, and the improvement plans are discussed.

2. The algorithm

Our Monte Carlo algorithm was conceived to provide accurate enough results for a wide range of situations using a small amount of input data and computing resources. Under this approach, we neglected several effects on the transportation of photons and electrons that are only expected to be relevant at either high energy or very small scale. For the transportation of photons, pair production (energy threshold of 1.02 MeV) was ignored. Besides, several simplifications were made in photoelectric absorption, coherent scattering, and incoherent scattering. For the transportation of electrons, we developed a novel method to account for multiple scattering and collisional energy loss in a very simple and fast way. Bremsstrahlung was also ignored because it is only significant at high energy and heavy media.

We assume a single target object made of one or more homogeneous materials and a beam of photons or electrons generated either inside or outside this object. Only a few simple geometries for both objects and particle beams are considered to reduce the calculations and the simulation settings. All the individual particles interacting with the object are tracked, but only keeping information on the energy deposit in a voxel-based scheme. Histograms of other relevant parameters of the beam particles (e.g., the angle and energy of escaping particles, the absorbed energy, and the maximum depth of electrons) can also be computed.

Next, the approximations made in the transportation of photons and electrons are described. In the last subsection, we briefly report on the LegPy package [\[6\]](#page-8-4) and its simulation options.

2.1. Photon transportation

The algorithm transports photons in random steps. The distance a photon travels before it undergoes its next interaction is randomly obtained from its mean free path (mfp), which is calculated from the total attenuation coefficient of the medium at the photon energy. The photon is transported this distance in the direction of its momentum vector to the next interaction point as long as it is inside the same medium, otherwise, the photon escapes the object or the medium changes. In the latter case, the photon is transported to the boundary between the two media to take another step in the new medium. If the photon is below the specified energy cut after an step, it is absorbed.

When a photon interacts, the type of interaction (i.e., photoelectric absorption, coherent and incoherent scattering) is determined at random from the relative attenuation coefficients of the different processes. Both total and relative attenuation coefficients are obtained by interpolation from tables taken from the NIST Standard Reference Database XCOM [\[7\]](#page-8-5), which provides data down to 1 keV. If photoelectric absorption takes place, an electron is emitted with a kinetic energy and propagation direction equal to those of the absorbed photon. In the case of incoherent scattering, the momentum vector and energy of both the photon and the electron are sampled from the differential cross section, given by the Klein-Nishina formula [\[8\]](#page-8-6), and the energy-momentum conservation laws. If the photon undergoes a coherent scattering, the Thompson scattering law [\[8\]](#page-8-6) is used to randomly deviate its track. In our present implementation of the algorithm, a simple rejection sampling is used in both incoherent and coherent scattering, since these processes were checked to not contribute significantly to the computing time in most cases.

As already mentioned, pair production is not included in our simplified algorithm. Nevertheless, the attenuation coefficient corresponding to this process (also taken from the NIST database [\[7\]](#page-8-5)) is added to that of photoelectric absorption so that the attenuation of a photon beam is properly simulated even for energies over the pair-production threshold. Furthermore, the atomic effects on the above processes are ignored. In particular, the fluorescence subsequent to photoelectric absorption or incoherent scattering, i.e., the emission of X-rays by the excited atom, is not included. This is one of the main limitations of

our approximation, because X-rays spread the energy deposit at larger distances than photoelectrons do. Neglecting this effect has a significant impact for heavy elements, as will be discussed later. However, our approximation is accurate enough for light elements.

2.2. Electron transportation

The electron transportation is based on the continuous slowing down approximation (CSDA), that is, the rate of energy loss of an electron along its track is assumed to be determined by the total stopping power neglecting fluctuations. Therefore, the total path traveled by an electron is assumed to be equal to the CSDA range in the medium. Both the total stopping power and the CSDA range are obtained by interpolation from tables taken from the NIST Standard Reference Database ESTAR [\[9\]](#page-8-7).

The electron path is divided into a number of steps. The default option is a constant step length equal to the voxel size used to describe the object, which determines the precision of the calculations. As an alternative, the step length can be computed so that the energy loss is a constant fraction of the electron energy in each step. Since energy-loss fluctuations are neglected, the simulation uses precomputed tables with the electron energies at the endpoints of all the steps in each constituent material of the object. When an electron is generated with a given initial energy in a medium, the energy loss and distance traveled in its first step are obtained by interpolation from the corresponding table. All the subsequent steps follow this table until the electron energy is below the specified energy cut, it escapes the object or the medium changes. In the latter case, the last step in the first medium is shortened to end at the boundary between the two media, and the energy loss is calculated accordingly. Then, the electron continues to be transported in the second media (if any) as if it had been generated at that point.

In each step, the end position of the electron is determined by its starting position, its propagation direction, and the step length, i.e., the electron is assumed to travel in a straight line ignoring the lateral displacement due to multiple scattering. On the other hand, after the step is taken, the electron propagation direction is randomly deviated. The axial angle of the deviation is a random number in the $0 - 2\pi$ interval and the scattering angle θ is sampled from a Gaussian distribution [\[10\]](#page-8-8)

$$
P(\theta) = \frac{1}{\sqrt{2\pi}\theta_0} \exp\left(-\frac{\theta^2}{2\theta_0^2}\right),\tag{1}
$$

where the average scattering angle θ_0 is given by

$$
\theta_0 = \frac{E_0}{\beta c p} \sqrt{\frac{s}{X_0}} \left(1 + 0.038 \ln \frac{s}{X_0 \beta^2} \right).
$$
 (2)

Here, s is the step length, X_0 is the radiation length of the medium, β is the ratio of the electron velocity and the speed of light *c*, *p* is the electron momentum and E_0 is a model parameter. In the Gaussian approximation described in [\[10\]](#page-8-8), *E*⁰ takes the value 13.6 MeV. However, we modified this parameter to compensate for the various simplifications made in electron transportation. First, we searched the values of E_0 that make

our algorithm reproduce approximately both the energy deposit distribution and the backscattering factor obtained by PENE-LOPE [\[2\]](#page-8-1) for the energy range $0.1 - 5.0$ MeV and a number of media. Then, from these fitted values, we obtained the following parameterization of E_0 in MeV:

$$
E_0 = 13.6 (1.56 + 0.130x)
$$

[1 – (0.0471 – 0.0182 ln x) ln E] (3)

where $x = 1/$
The necess √ *X*⁰ for *X*⁰ expressed in cm and *E* in MeV.

The necessary θ_0 values are calculated at the beginning of the simulation and stored in the table of steps for each medium. The results obtained with this simple model of multiple scattering were checked to be almost independent of the step length as long as it is smaller than 10% of the CSDA range.

As a further simplification, half of the energy lost by an electron in a step is deposited in the starting voxel and the other half in the end one. To avoid discontinuities in the energy deposit distribution, the step length should not be larger than the voxel size. Besides, when an electron reaches the boundary between two media, the energy loss in that step is assumed to be fully deposited in the starting voxel to prevent artifacts just at the boundary. In our approximation, no secondary particles are simulated. In particular, Bremsstrahlung is ignored, which limits the applicability of our algorithm to moderate electron energies (i.e., < 5 MeV for heavy materials).

The use of all these approximations speeds up the simulation considerably while a reasonable accuracy is achieved for many applications, as will be shown in section [3.](#page-2-0) The main limitation is the underestimation of the maximum range of electrons because their total path length is imposed to equal the CSDA range.

2.3. LegPy framework

LegPy stands for "low energy gamma-ray simulation in Python", but it allows the simulation of both photons and electrons using the approximations described above. The code is organized as a Python package containing classes to define the basic ingredients of a simulation: the beam geometry, the energy spectrum and type of the incident particles, the object geometry, the medium (or media) the object is made of, and the simulation settings. LegPy is designed to be used in Google Colab [\[11\]](#page-8-9) or Jupyter Notebook, which are interactive environments that improve user experience. Several notebook examples are included in the last release of this software package.

The package includes a library of media containing all the necessary data taken from NIST databases, so the user only has to choose the media from this library. Adding new media to the library is also quite easy. Presently, only three object geometries are supported: sphere, cylinder and orthohedron. In the two latter cases, the object is assumed to be oriented along the z axis. The object can be divided into two regions of different materials, with the boundary being a horizontal plane, a coaxial cylindrical surface (only for cylindrical objects), or a concentric spherical surface (only for spherical objects). Any object can be divided into voxels in Cartesian coordinates, although spherical and cylindrical voxelizations are also available

for objects having these symmetries. The user only needs to select the geometry, input the dimensions of the object in the corresponding coordinates, give the number of voxels along each dimension of the object and, when applicable, set the position of the boundary.

The beam of particles is modeled in a simple way with a few parameters. The user may choose between a point source at any position inside the object and a parallel or divergent beam entering the bottom face of the object (only for a cylinder or an orthohedron). In the latter case, the user can set the angle of incidence, the position of the focal point (for a divergent beam) or the center of beam at the entrance plane (for a parallel beam), the shape of the beam (i.e., circular or rectangular) and its size at the entrance. Whether the beam particles are photons or electrons, a set of predefined energy spectra are available (e.g., monoenergetic, exponential, flat, Gaussian or given by a text file). For photon beams, the tracking of secondary electrons can be turned on and off.

All these simplifications and default options provide a simple but flexible simulation framework. In Fig. [1,](#page-3-0) a sample of code that executes a simulation with LegPy and a couple of output plots are shown. The object dubbed "result" in this example stores the results of the simulation and has several methods to plot the energy deposit distribution, the particle tracks and histograms of various relevant parameters. The package includes additional functions to analyze the simulation results. All the results shown in this paper have been obtained with LegPy.

3. Validation of the algorithm

In order to check the validity of the code, a number of tests were made to compare our results with experimental data and those from other MC codes. In particular, we carried out systematic comparisons with the well-established code PENE-LOPE [\[2\]](#page-8-1). These tests were done for the geometries currently supported by LegPy, i.e., cylinder, orthoedron, and sphere, and for the cases of a single medium and two media. Monoenergetic beams of photons and electrons in the range 0.1−5.0 MeV were used.

As will be shown below, for these comparisons the number of events simulated with both LegPy and PENELOPE were in general sufficient to reduce statistical fluctuations below the observed systematic deviations due to the simplifications of the LegPy algorithm. Number of events in between 5×10^5 and 1×10^7 were enough, depending of the case, to this end.

The energy threshold for transporting both photons and electrons has been set to 1.0 keV for both LegPy and PENELOPE. In addition, PENELOPE uses another tracking parameters for the transportation of electrons. For these comparisons, we have set the following values $C_1 = C_2 = 0.05$ and $W_{cc} = W_{cr} =$ 250 eV, as suggested in the PENELOPE manual [\[26\]](#page-8-10).

3.1. Photon beams

For these tests, the LegPy simulations were carried out without the transportation of secondary electrons, that is, the electrons generated by a photoelectric absorption or a Compton effect are assumed to be absorbed depositing their kinetic energy import LegPy as lpy

 $b)$ # Cylinder 0.4 cm in diamater and 0.4 cm in length. 40x40x40 voxels in Cartesian coordinates geometry = lpy.Geometry(name='cylinder', diam=0.4, z=0.4, z_ch=0.3, n_x=40, n_y=40, n_z=40) # Water: 0 cm < z < 0.3 cm; Pb: 0.3 cm < z < 0.4 cm $median1 = 1py.Medium(name='water')$ $a)$ $median2 = 1py.Medium(name='Pb')$

Parallel electron beam with circular cross section of 0.1 cm in diameter beam = lpy.Beam(particle='electron', name='parallel', diam=0.1) # Exponential energy spectrum from 0.1 MeV to 2 MeV with decay rate of 1 MeV spectrum = lpy.Spectrum(name='exponential', E_min=0.1, E_max=2., E_ch=1.)

Simulation performed for 500000 electrons

result = lpy.MC([medium1, medium2], geometry, spectrum, beam, n_part=500000)

Figure 1: Example of the use of LegPy. a) Sample of code that sets up and executes a simulation of a parallel beam of electrons that traverses a coaxial cylinder of water and lead. b) Tracks of 50 electrons. c) 2D distribution of deposited energy at several depths.

in the production point. In the first set of tests, the dose in depth calculated with LegPy for several media at various energies was compared with the results from PENELOPE and MCNP5. Other tests were focused on the angular distribution of escaping photons and the energy spectra of absorbed energy relevant to the characterization of scintillators.

The dose in depth comparisons were done through the buildup factor *B* for a point source in an infinite medium, which is defined as

$$
B = \frac{D_{\rm r}}{D_{\rm t}}\tag{4}
$$

where $D_r(R)$ is the "real" dose as a function of the distance from the source *R*, which can be calculated by simulation. The "theoretical" dose $D_t(R)$, that is, the expected one if secondary radiation (e.g., Compton scattered photons) is ignored, can be calculated from the expression

$$
D_{t}(R) = \frac{1}{4\pi R^{2}} \exp\left(-\mu R\right) \left(\frac{\mu_{\text{en}}}{\rho}\right) E
$$
 (5)

where μ and μ_{en}/ρ are respectively the linear attenuation coefficient and the mass absorption coefficient of the medium at the photon energy *E*, tabulated in [\[7\]](#page-8-5).

Buildup factors are very relevant in engineering materials for shielding calculations. A database (ANSI/ANS-6.1.1, 1991) is available in [\[12\]](#page-8-11) and their values are confirmed by MC simulations with EGS4 [\[13\]](#page-8-12), [\[14\]](#page-8-13). These parameters are also of the most relevance in medical physics [\[15\]](#page-8-14), [\[16\]](#page-8-15).

We calculated $B(R)$ for water, iron, and lead at energies of 0.1, 0.3, 1.0, and 5.0 MeV using both LegPy and PENELOPE. To do that, we simulated a point source at the center of a sphere

of large radius, i.e., 15 mfp of the corresponding material. In addition, we used the updated ANSI/ANS-6.1.1 buildup factor database [\[17\]](#page-8-16), [\[18\]](#page-8-17) obtained by MCNP5 simulations [\[19\]](#page-8-18). The results are compared in figures [2](#page-4-0) - [4.](#page-4-1) Note that comparing the buildup factor is equivalent to comparing the dose, assuming that the same μ and μ_{en}/ρ coefficients are used.

 -0.2

 -0.1

 0.0

 0.4

 0.3 z (cm)

 0.2

 0.1

 0.0

 0.2

 0.1

Statistical fluctuations for depths smaller than 5 mfp are well below 1% for all cases shown here and for both simulations, LegPy and PENELOPE. The fluctuations grow at larger depths, although the error bars can only be appreciated in a few points and are significantly smaller than the systematic deviations of LegPy due to our simplifications.

As can be seen in Fig. [2](#page-4-0) (upper plot), the buildup factors for water obtained with LegPy are in good agreement with those obtained with both PENELOPE and MCNP5. The deviations of LegPy results with respect to those from PENELOPE (lower plot) are at the level of less than 5% for $R < 4$ mfp, growing up to about 10% at 10 mfp. Notably, the agreement is very good even at 5.0 MeV, confirming that the impact of ignoring pair creation and Bremsstrahlung on the calculation of the dose in depth is very weak in light elements even at energies of a few MeV.

Results for iron at 0.3, 1.0 and 5.0 MeV are shown in Fig. [3.](#page-4-2) Again, the simplifications made in LegPy do not seem to have a relevant impact in the calculation of the dose at these energies. At 0.1 MeV (not shown in the figure), LegPy also reproduces the result from PENELOPE up to about 4 mfp but underestimates it by 30% at 10 mfp. This deviation is attributed to the simplified treatment of the coherent scattering in LegPy.

The results for lead at 0.3, 1.0, and 5.0 MeV are shown

Figure 2: In the upper plot the buildup factors versus depth (in mean free path units) in water obtained with LegPy (continuous lines) are compared with those obtained with PENELOPE (full circles) and MCNP5 (triangles). The deviations of LegPy results with respect to those from PENELOPE are shown in the lower plot.

Figure 3: Same as figure [2](#page-4-0) for iron.

in Fig. [4.](#page-4-1) LegPy is in agreement (δ < 10%) with PENE-LOPE up to about 4 mfp with larger deviations (up to 30%) at large depths. Again, the effect of ignoring pair creation and Bremsstrahlung is not very relevant in the depth dose calculation even at 5 MeV. However, we found very large deviations with respect to both PENELOPE and MCNP5 at 0.1 MeV, which are attributed to ignoring X-ray fluorescence. It is well known [\[20\]](#page-8-19) that, for heavy atoms, X-ray fluorescence leads to a dramatic increase in buildup factors for photon energies slightly above the K edge of the photoelectric cross section. Indeed, the value of $B(R)$ obtained by PENELOPE is larger than that obtained with LegPy by a factor of $6(50)$ at a depth of 5 mfp (10 mfp).

We carried out another set of tests for the angular distribution of photons escaping the medium. We simulated pencil beams of various energies traversing a cylinder of water with both height and diameter equals to one mfp at the corresponding energy. The LegPy results for 0.2, 1.0, and 5.0 MeV are compared with those from PENELOPE in Fig. [5.](#page-4-3) Statistical fluctuations in

Figure 4: Same as figure [2](#page-4-0) for lead. The small error bar at large depth accounts for the statistical fluctuations of the simulations

Figure 5: Angular distribution of outgoing photons for 0.2, 1.0 and 5.0 MeV pencil beams on a water cylinder of one mean free path size. Results from LegPy (points) are compared with those from PENELOPE (continuous line). See text for details.

both simulations are smaller than or about 1%, except for angles close to 0 or 180 degrees because of the small solid angle. We found that the agreement is very good up to 2.0 MeV, with deviations within the above statistical fluctuations, while LegPy results deviate significantly from those from PENELOPE at higher energies (up to about 30% at 5 MeV). From these simulations, we also calculated the distribution of energy absorbed by the medium. The results are shown in Fig. [6.](#page-5-0) The agreement is very good in the photopeak and in the whole Compton profile before the sharp decrease at the edge, with deviations smaller than 2% for energies up to 2 MeV. These deviations grow up to about 15% at 5 MeV. In the deep Compton edge deviations are hidden by large statistical fluctuations. On the other hand, LegPy does not reproduce some spectral features associated with processes ignored in our algorithm, e.g., escape of annihilating photons subsequent to pair creation.

An interesting test was done for isotropic beams of 0.667 and 1.275 MeV (emulating radioactive point sources of $137Cs$ and 22 Na) at a distance of 2 cm from a NaI cylinder with both diameter and height of one mean free path $(4.34 \text{ cm for }^{137}\text{Cs}$ and

Figure 6: Spectra of absorbed energy for the same simulation tests as used in Fig. [5.](#page-4-3)

Figure 7: Spectrum of absorbed energy for isotropic sources of 0.667 and 1.275 MeV on a NaI cylinder. Results from LegPy (points) are compared with those from PENELOPE (continuous line). See text for details.

5.32 cm for 22 Na). As can be seen in Fig. [7,](#page-5-1) the main features of the spectrum of absorbed energy obtained with LegPy, i.e., the shape of the Compton profile and the height of the photopeak, are in good agreement with the one obtained with PENELOPE (i.e., deviations $\leq 5\%$). However, PENELOPE predicts a small peak shifted by about 30 keV from the photopeak due to the escape of X-rays produced after the photoelectric absorption in the K shell of Iodine. This feature, which is generally irrelevant for the characterization of a scintillator, cannot be reproduced by LegPy because X-ray fluorescence is ignored in our algorithm.

3.2. Electron beams

For the validation of LegPy for the transportation of electrons, the dose in depth, the backscattering coefficient and the angular distribution of backscattered electrons were obtained for a pencil beam of monoenergetic electrons going along the axis of a semi-infinite cylinder (i.e., larger than the corresponding CSDA range). Different media were tested in the energy range 0.¹ [−] ⁵.0 MeV. The step length for the transportation of

electrons was set to 1% of the CSDA range. As in the previous section, we repeated the simulations with PENELOPE to compare with LegPy. The simulation results were also compared with experimental data on energy deposition of electron beams on different media and backscattering coefficients, which are available in the literature for a wide energy range [\[21\]](#page-8-20), [\[22\]](#page-8-21) and have been used since long ago to benchmark PENELOPE [\[23\]](#page-8-22) and GEANT4 [\[24\]](#page-8-23), [\[25\]](#page-8-24).

In figures [8](#page-5-2) and [9,](#page-6-0) depth dose in water for electrons at several energies in the range $0.1 - 5.0$ MeV obtained with LegPy are compared with the results from PENELOPE. As explained above, the fluctuations in energy deposition are ignored in our simplified algorithm in such a way that the path length of all electrons equals the CSDA range. As a consequence, the dose at depth beyond the CSDA range obtained with LegPy is zero while the energy is spread to larger distances for the PENE-LOPE results. Apart from this discrepancy, LegPy reproduces reasonably the results from PENELOPE with deviations in the maximum of the dose in depth function smaller or around 10%. These discrepancies are a consequence of the approximations made in the multiple scattering and collisional energy losses in our algorithm.

Figure 8: Depth dose for electron beams of 0.1, 0.2, and 0.5 MeV on water. The results from LegPy (continuous lines) are compared with those from PENELOPE (full blue circles).

The results for aluminum are shown in Fig. [10.](#page-6-1) LegPy reproduces the depth dose of PENELOPE with similar deviations to those obtained for water. Available experimental data at 0.31, 0.52, and 1.03 MeV [\[21\]](#page-8-20) are in very good agreement with PENELOPE. Similar results were found up in the whole range between 0.1 and 5.0 MeV.

The results for copper are shown in Fig. [11.](#page-6-2) LegPy also reproduces reasonably the dose in depth at energies below 1 MeV. The discrepancy turns out significant at 5.0 MeV (16% at the depth dose maximum), very likely due to ignoring the Bremsstrahlung production. For very heavy elements, such as uranium, this discrepancy exists even at lower energies, as expected (Fig. [12\)](#page-6-3).

Electron backscattering in LegPy was also compared with the results from PENELOPE. In general, we found a good agree-

Figure 9: Same as Fig. [9](#page-6-0) for 1.0, 2.0 and 5.0 MeV.

Figure 10: Depth dose for electron beams of 0.31, 0.52, and 1.03 MeV on aluminum. The results from LegPy (continuous lines) are compared with those from PENELOPE (full blue circles) and experimental data from [\[21\]](#page-8-20) (red triangles).

ment in the shape of the angular distribution of backscattered electrons obtained with both simulation codes. As an example, we show the results for copper at 0.1 and 2.0 MeV in Fig. [13,](#page-7-1) where deviations are in general smaller than 5%. On the other hand, LegPy tends to underestimate the backscattering coefficient η (i.e., the ratio between incoming and backscattered electrons) for light elements. For instance, in water at 1.0 MeV, the PENELOPE result is $\eta = 3.0\%$ while it is half that value for LegPy. The agreement in the backscattering coefficient improves for heavier elements. For aluminum at 1.03 MeV, LegPy gives $\eta = 8.0\%$ to be compared with the value of $\eta = 9.5\%$ obtained with PENELOPE, which is in good agreement with the experimental value of 9.2% [\[22\]](#page-8-21). For copper at 2.0 MeV (Fig. [13\)](#page-7-1), LegPy gives $\eta = 28\%$ while PENELOPE gives $\eta = 29.5\%$. For uranium at 1 MeV, the PENELOPE result is $\eta = 51\%$ versus $\eta = 44\%$ from LegPy.

Figure 11: Same as Fig. [10](#page-6-1) for 0.1, 0.2, and 0.5 MeV electrons on copper.

Figure 12: Same as Fig. [10](#page-6-1) for 0.2, 0.5 and 1.0 MeV electrons on uranium.

3.3. Beams in a two media object

Several tests were made to check the performance of LegPy for transporting photons and electrons through an object composed by two different media. As an example, in Fig. [14,](#page-7-2) we show the dose in depth for a photon beam of 10 cm diameter and 1.0 MeV energy crossing along its axis a cylinder of 2.0 cm length with a 100 cm diameter (i.e., laterally infinite) to assure that all scattered radiation except the backscattered one is absorbed. The cylinder is made of water and lead, the boundary between the two media being at a depth of 1.0 cm. The transportation of secondary electrons is included in the simulation with a step length of 7 μ m and a voxel size of 90 μ m in order to study the details at the boundary. As can be seen in the figure, the dose in depth obtained with LegPy is in good agreement with the result from PENELOPE. The average deviation is of about 1.5% with a maximum value of 3% around the interface surface. Note the relevant role of secondary electrons in the dose in depth. Electronic equilibrium is reached at about 2.5 mm and the backscattering in lead is very strong. We checked that similar agreements with PENELOPE are achieved at 0.3 and 5.0 MeV.

Tests for an electron beam traversing a two-media cylinder

Figure 13: Angular distribution of backscattered electrons in copper. The results from LegPy (red points) are compared with those from PENELOPE (black points)

were also carried out. As an example, in Fig. [15](#page-7-3) it is shown the dose in depth for a pencil beam of 1.0 MeV electrons crossing a cylinder of 0.164 cm length and 0.20 cm diameter, made of aluminum and lead. The step length was set to 1% of the CSDA range of the electrons in lead. Several cases were studied varying the depth z_b of the boundary between the two media. The results of the figure correspond to z_b values of 0.0411, 0.082, and 0.123 cm as well as to the only-Al case. LegPy reproduces the features of the behavior of the dose around the interface due to backscattering. However deviations with respect to PENE-LOPE are up to 15%, basically due to the approximations in the electron transportation, as already discussed in [3.2.](#page-5-3)

Figure 14: Dose in depth for a beam of 1.0 MeV photons on a water - lead cylinder along the z axis. The dashed line indicates the position of the boundary between the two media. See text for details. The results from LegPy (black points) are compared with those from PENELOPE (red points)

4. Conclusions

In this paper, we have presented a simplified algorithm for the simulation of the passage of low-energy electrons and gamma

Figure 15: Dose in depth for an electron beam of 1.0 MeV on an aluminum - lead cylinder along the z axis. The dashed lines indicate the position of the boundary between the two media. See text for details. The results from LegPy (red points) are compared with those from PENELOPE (red points)

rays through any medium. The algorithm has been realized in the Python package called LegPy available under an open source license.

The algorithm has been validated by comparing a set of results with the code PENELOPE as well as with available experimental data. From the comparisons for photon beams, we can state that LegPy is able to calculate with reasonable accuracy (i.e., \leq 5%) the dose deposited by photons of up to 5 MeV in light media at depths of up to five mean free paths. This is particularly interesting for applications in medical physics as long as very high accuracy is not required. The algorithm can also reproduce accurately the spectrum of absorbed energy in light elements as well as in typical scintillator materials used in gamma-ray spectrometry. The results of the angular distribution of escaping photons obtained with LegPy are also in good agreement (around 1%) with those from PENELOPE, but results for water at 5 MeV have significant deviations, indicating that the scattering of photons is more sensitive to the approximations employed in our algorithm. We found that the main limitation of our algorithm for the simulation of low-energy gamma rays is that it is not valid at energies close but higher than that of the K shell of heavy elements. We plan to implement soon a simplified model for the X-ray fluorescence in our algorithm to solve this problem. Even though pair production is also ignored, we found that this process is not very relevant for the dose deposited by photons of up to 5 MeV in heavy media.

Regarding the transportation of electrons, we have presented a very simple model that provides reasonable results of both the dose in depth and backscattering. Our results of the dose in depth in light elements deviate from those from PENELOPE by less than or around 10% at the maximum of the depth in dose function. For heavy elements, deviations remain small up to a few MeV, but LegPy underestimates significantly the energy deposition at higher energies as a consequence of ignoring the Bremsstrahlung effect. In general, backscattering is properly simulated with LegPy in heavy elements. The most significant deviations with respect to PENELOPE were found for light elements, although they have a minor effect in most practical cases because backscattering is only relevant for heavy elements.

LegPy has also been tested for the simulation of photons and electrons around the boundary between two media. The expected effects are properly observed and results are in good agreement with those obtained with PENELOPE for a 1 MeV photon beam ($\leq 3\%$), but the agreement is somewhat worse for electron beams due to the strong simplifications of our algorithm.

LegPy was conceived to be used in a flexible and interactive way in a Google Colab or Jupyter notebook. In spite of using a Python interpreter, the several simplifications of our algorithm make in general the simulations rather fast compared to detailed simulation codes as PENELOPE, especially when the number of interactions is large (e.g., at high energy and heavy media). For example, the computing times needed to get the results of dose deposited by 5 MeV photons in lead shown in Fig. [4](#page-4-1) were around 4 times smaller for LegPy than for PENE-LOPE when the tracking of secondary electrons is deactivated in both codes. The tracking of electrons is what demands the most CPU time, therefore our simplified model speeds up the simulation of electrons significantly. In the previous example, LegPy simulations including secondary electrons with an energy cut of 1 keV and a step length of 1 mm are faster by a factor of 80 than PENELOPE simulations with the same energy cut for electrons and tracking parameters of $C_1 = C_2 = 0.05$ and $W_{\text{cc}} = W_{\text{cr}} = 250 \text{ eV}$. Obviously, the accuracy reached by PENELOPE is much higher.

In summary, an easy-to-use tool for fast simulations of low energy gamma-rays and electrons is available. LegPy aims to be useful for researchers that need simulations on simple geometries with reasonable accuracy (i.e., around 10%) but without the technical complexity of other MC codes. As the tool is very easy to use, it may also be useful for teaching purposes in undergraduate or postgraduate degree programs as well as for the training of experts in the field of medical applications of ionizing radiation.

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