

# A benchmarking study of Geant4 for Auger electrons emitted by medical radioisotopes

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1 2	A benchmarking study of Geant4 for Auger electrons emitted by medical radioisotopes
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### 22 Abstract

23 Auger emitting radioisotopes are of great interest in targeted radiotherapy because, once 24 internalised in the tumour cells, they can deliver dose locally to the radiation sensitive targets, 25 while not affecting surrounding cells. Geant4 is a Monte Carlo code widely used to 26 characterise the physics mechanism at the basis of targeted radiotherapy. In this work, we 27 benchmarked the modelling of the emission of Auger electrons in Geant4 deriving from the decay of <sup>123</sup>I, <sup>124</sup>I, <sup>125</sup>I radionuclides against existing theoretical approaches. We also compared 28 Geant4 against reference data in the case of <sup>131</sup>Cs, which is of interest for brachytherapy. In 29 the case of <sup>125</sup>I and <sup>131</sup>Cs, the simulation results are compared to experimental measurements 30 31 as well. Good agreement was found between Geant4 and the reference data. As far as we 32 know, this is the first study aimed to benchmark against experimental measurements the 33 emission of Auger electrons in Geant4 for radiotherapy applications.

### 34 Keywords

35 Auger electron, radioactive decay, Monte Carlo, Geant4.

### 36 **1. Introduction**

- 37 The Auger effect involves the emission of atomic electrons as alternative channel to X-ray
- 38 fluorescence in the atomic de-excitation, which follows the creation of a vacancy in an atomic

39 shell [1], [2]. Auger electron emitting radionuclides are of great interest in targeted 40 radiotherapy because Auger electrons have high Linear Energy Transfer (4–26 keV/ $\mu$ m) and 41 short range [3]–[6].

The present paper reports on the Auger electron emission following the radioactive decay of <sup>123</sup>I, <sup>124</sup>I, <sup>125</sup>I and <sup>131</sup>Cs. The iodine radioisotopes are widely used in nuclear medicine for the labelling of monoclonal antibodies, receptors and other radio-pharmaceuticals, especially in diagnostic and therapeutic applications, where quantitative imaging over a period of several days is necessary [7]–[9]. The optimal combination of half-life and energy of the emitted radiation makes <sup>131</sup>Cs an attractive radioisotope for brachytherapy of malignant tumours.

Geant4 [10] is a Monte Carlo code which is extensively used in medical physics applications,
including micro- and nano- dosimetry [11], [12], brachytherapy and targeted radiotherapy
[13], [14]. Therefore, it is important to benchmark the emission of Auger electrons in Geant4

51 against reference data.

The goal of this work is to benchmark, for the first time, Geant4 in terms of emission of Auger electrons. A Geant4 simulation was developed to calculate the emission yields and energy spectra of Auger electrons emitted from <sup>123</sup>I, <sup>124</sup>I, <sup>125</sup>I and <sup>131</sup>Cs radionuclides. The results were compared to other Monte Carlo based calculations available in the literature and experimental measurements performed at the Australian National University (ANU) and the Joint Institute for Nuclear Research (JINR) in the case of <sup>125</sup>I and <sup>131</sup>Cs, respectively.

# 58 2. Materials and methods

### 59 **2.1. Radioactive decays under investigation**

- 60  $^{123}$ I (half-life T<sub>1/2</sub> = 13.224 hr) decays by electron capture (EC) (100% probability) to an excited 61 state of  $^{123}$ Te. The strongest transition at 159 keV carries 99% of the total intensity and 19% 62 of the time will decay via internal conversion (IC) to  $^{123}$ Te, which has a very long half-life (T<sub>1/2</sub> 63 = 9.2×10<sup>16</sup> year) [15].
- 64 <sup>124</sup>I (T<sub>1/2</sub> = 4.176 d) decays via either β<sup>+</sup> (22.7% probability) or EC (77.3% probability) to either 65 excited states (65% probability) or to the ground state (35% probability) of <sup>124</sup>Te [16].
- <sup>131</sup>Cs decays directly via EC decay to the ground state of <sup>131</sup>Xe, hence, Auger electrons are only emitted from the atomic relaxation in <sup>131</sup>Xe from the vacancy created by EC. <sup>131</sup>Cs is one of the pure Auger emitters for nuclear medicine [18].

# 71 **2.2.** Atomic Relaxation in Geant4

Geant4 has the functionality of simulating both the radiative (X-ray) and non-radiative (Auger) atomic relaxation process of singly ionised atoms [19], [20]. Geant4 treats ionised atoms as isolated entities [21]. This means that an atom exists separately without bonding with any other atom. The creation of a vacancy is handled by the Geant4 electromagnetic physics package. The generation of the relaxation cascade is handled by the atomic relaxation component, which is used by all the primary processes generating a vacancy [19], [20], [22]. The simulation of atomic relaxation takes place in two stages: determination of the shell (or sub-shell) where the vacancy is created by the primary
 process, radioactive decay in this case;

the relaxation cascade is then triggered, starting from the vacancy created by the
 primary process; secondary photons or electrons are generated through radiative and
 non-radiative transitions, based on the respective transition probabilities [19]–[22].

84 In stage 1, the *G4RadioactiveDecay* module is used to simulate the decay, either at rest or in-85 flight, of radioactive nuclei by electron capture (EC) and by  $\alpha$ ,  $\beta^-$  and  $\beta^+$  emission or isomeric 86 (IT) decay. If the daughter of a nuclear decay is an excited isomer, its prompt nuclear de-87 excitation is treated using the *G4PhotoEvaporation* class [10].

The subshell ratios for electron capture is calculated according to Bambynek [23]. In this model only electrons from the  $s_{1/2}$  and  $p_{1/2}$  subshells (K, L1-L2, M1-M2, N1-N2) are captured. Whereas, for internal conversion the probabilities are specified in Geant4 *PhotoEvaporation5.5* data library (version used in this work). These probabilities are computed with BRICC code [24], except if they are provided in the ENSDF files.

Geant4 uses the Livermore Evaluation Atomic Data Library EADL [21] in stage 2 to calculate the complete radiative and non-radiative emission of X-rays and Auger electrons as the atom relaxes [10]. The energy of the relaxation product is calculated as the difference of the subshell binding energies involved with the atomic de-excitation process [21]. It is assumed that the binding energy of all subshells are the same for neutral ground state atoms as for ionised atoms [10], [21]. The Geant4 Atomic Relaxation model does not distinguish between Auger and Coster-Kronig transitions [20], thus, the term Auger is used for both transitions.

#### 100 2.3. Geant4 simulation setup

101 The Geant4 extended example rdecay01 was used in this study and Geant4 10.05.p01 version 102 has been adopted. A cube of 20 mm size of vacuum is modelled, with a point source of <sup>123</sup>I, <sup>124</sup>I, <sup>125</sup>I and <sup>131</sup>Cs in the centre of the box. The radioactive decay and the full atomic relaxation 103 104 are modelled. The output of the simulation is the emission yield per radioactive decay and 105 the energy spectra of the emitted Auger electrons. The number of histories in the Geant4 106 simulation is 10<sup>7</sup> to obtain a statistical uncertainty below 1%. Nevertheless, it should be noted 107 that the uncertainty of EADL Auger electrons yields for an inner shell vacancy is less than 15% 108 [21]. Only inner shell vacancies are considered in this work when comparing the simulation 109 results to experimental data. The calculated Auger electron spectra were binned using 50 eV 110 bin width. In the analysis of the results, the Auger electrons have been grouped according to 111 the IUPAC notation, based on the atomic shells involved in the transition [25]. Following this 112 notation, Auger MXY, M-shell Auger transition where neither of the two new vacancies is in 113 the N-shell. Auger LMX, L-shell Auger transition where one of the vacancies is in the M-shell. 114 Auger LMM, L-shell Auger transition where both new vacancies are in the M-shell. Auger KLL, 115 K-shell Auger transition where both new vacancies are in the L-shell. Auger KLX, K-shell Auger 116 transition where one of the two new vacancies is in the L-shell. And Auger KXY, K-shell Auger 117 transition where neither of the two new vacancies is in the L-shell.



#### Fig. 1 Energy ranges for Auger electron groups in tellurium according to EADL [21]. Overlapping energy ranges are indicated with red squares below the axis.

118 Each individual Auger electron energy line calculated by means of the Geant4 simulation 119 needs to be associated to the specific transition producing it, as this information is not 120 provided automatically in a Geant4 user application. This method has been adopted as 121 currently it is not possible to directly retrieve the transition type in a Geant4 user application. 122 In the analysis of the simulation results, Auger KLL, KLX, and KXY lines were grouped according 123 to their energy ranges in EADL [21], as shown in Fig. 1 (e.g., the line 3.6185 keV matches with L2M1O3 transition energy (EADL [21]), so it belongs to group LMX). To note, the Geant4 124 125 simulation results showed a slight energy broadening of the Auger lines due to momentum 126 transfer to the daughter of the radioactive decay. When we find two transitions for the same 127 energy in overlapping energy ranges as represented in Fig. 1, the difficulty to retrieve the 128 transition shows up. This problem is due to the fact that the bin width in the simulation is 1 129 eV, which is greater than the difference between a few transition energies (e.g., the line 130 L3M5M5 3.17422 keV and L3M1N1 3.17429 keV (EADL [21])). In these situations, we decided 131 to choose the most probable transition for the specific line.

132 The mean energy,  $\overline{E}$  of each Auger transition groups (MXY, LMM, LMX, KLL, KLX and KXY) was 133 evaluated as:

$$\bar{E} = \frac{\sum_{i} (E_i \cdot Y_i)}{Y_{Total}}, \qquad (equation \ 1)$$

135

where  $E_i$  is the energy and  $Y_i$  is the yield of an Auger line in the group.  $Y_{Total}$  is the total yield of the Auger group.

#### 138 **2.4.** Theoretical approaches used to benchmark Geant4 atomic relaxation

The theoretical approaches used to benchmark Geant4 are based on the Monte Carlo based calculations by Pomplun [26], Stepanek [27] and the BrIccEmis by Lee et al., developed at the Australian National University (ANU) [3], [4], [28], [29]. Table 1 summarises the models and data libraries used in the calculations. In the BrIccEmis calculations the so-called *"isolated atom"* approximation was used, namely once a vacancy reached the valence shell, it remained unfilled.

Table 1. Atomic and nuclear data used in the calculations by Stepanek [27], Pomplun [26]
and in BrIccEmis [4], as well as in Geant4.

	Stepanek [27]	Pomplun [26]	BrIccEmis [4]	Geant4
Nuclear decay data	ENSDF [30]	ICRP38 [31]	ENSDF [30]	ENSDF [30]
Electron capture probabilities	Gove <i>et al.</i> [32] Martin <i>et al.</i> [33]	Gove <i>et al</i> . [32]	Schönfeld [34]	Bambynek <i>et al.</i> [23]
Atomic shells	K-N	K-N	K-O	K-O

Atomic transition rates	Perkins <i>et al.</i> (EADL) [21]	Storm <i>et al.</i> [35] Chen <i>et al.</i> [36] McGuire <i>et al.</i> [37]	Perkins <i>et al.</i> (EADL) [21]	Perkins <i>et al.</i> (EADL) [21]
Atomic transition	Dirac-Hartree-	Dirac-Fock	Dirac-Fock	Perkins <i>et al.</i>
energies	Slater [38]	Deslaux [39]	Band <i>et al</i> . [40]	(EADL) [21]

The yields of Auger electron emission have been calculated as described in Section 2.3 and also computed analytically (called here *Geant4Lib analytical code*) by using directly the radioactive decay, nuclear de-excitation, and atomic relaxation data contained in the Geant4 data libraries. This approach allows to verify that the input data libraries are used correctly by the Geant4 kernel when performing simulations of radioactive decay.

153 In the Geant4lib analytical code, the yield of a given Auger electron line is obtained by the 154 sum of the probabilities of the different disintegration branches leading to the emission of 155 this specific line. Each disintegration branch consists in the succession of a radioactive 156 disintegration of the parent nucleus to an excited state of the daughter, a cascade of nuclear 157 deexcitation with at least one electron conversion emission, and an atomic relaxation cascade 158 leading to the emission of the considered Auger line. The probability of a branch is obtained 159 by the product of the probability of all steps involved in the branch. This code does not take 160 into account the nuclear recoil broadening, which is instead considered in the full Geant4 simulation used in this work. 161

### 162 **2.5. Reference experimental measurements**

Two sets of experimental measurements of Auger electron spectra were used in this work. 163 The first set derives from experimental measurement with an <sup>125</sup>I source performed at the 164 ANU obtained with an electron momentum spectrometer (EMS) which can measure electrons 165 166 from 2 keV to 40 keV (the energy resolution of the spectrometer is  $\approx$  6 eV) [8]. The iodine 167 source was prepared at ANSTO (Australia's Nuclear Science and Technology Organisation) 168 with a NaI solution deposited on top of a 200  $\mu$ g/cm<sup>2</sup> gold substrate, following the procedure described by Pronschinske et al [41]. The resulting source was a monolayer of <sup>125</sup>I on top of 169 170 the gold substrate [42].

The second set of experimental measurements is documented in [43]. A BaCO<sub>3</sub> target was irradiated in the nuclear reactor IBR-2 of the JINR lab, Dubna, at the neutron flux of  $\sim 2.5 \times 10^{12} \frac{n}{cm^2.s}$  for 10 days. The electron spectrum was measured using a combined electrostatic spectrometer [44], consisting of a retarding sphere followed by a double-pass cylindrical mirror energy analyser [43].

Table 2 summarises the radioisotopes under study and the reference theoretical andexperimental data used to benchmark Geant4.

Table 2. List of reference published data used in this study. We compare only K-lines in the
 case of validation against experimental data.

	Calculations	Experimental
<sup>123</sup>	BrIccEmis [4] Pomplun [45]	-
<sup>124</sup>	BrIccEmis [4]	-
<sup>125</sup>	BrIccEmis [4] Stepanek [27] Pomplun (KLL spectrum) [26]	ANU (KLL spectrum) [8]
<sup>131</sup> Cs	-	JINR (KLL spectrum) [43]

180

### 181 **3. Results**

182 The first section shows the comparison of Geant4 results against the theoretical predictions 183 by BrIccEmis [4], [29], Pomplun [26], [45] and Stepanek [27] for <sup>123</sup>I, <sup>124</sup>I and <sup>125</sup>I in terms of 184 emission yields of Auger electrons. The second section is dedicated to the comparison against 185 experimental measurements for <sup>125</sup>I and <sup>131</sup>Cs radioisotopes.

#### 186 **3.1.** Comparison to other theoretical approaches

Fig. 2, 3 and 4 present the generated energy spectra and yield of Auger electrons for <sup>123</sup>I, <sup>124</sup>I
 and <sup>125</sup>I decays, respectively, using the Geant4 simulation described in Section 2.3 and
 BrIccEmis [4].



*Fig. 2 Calculated Auger electron spectrum following the radioactive decay of* <sup>123</sup>*I, normalized for 1 radioactive decay. K, L and M indicate the major Auger groups.* 



Fig. 3 Calculated Auger electron spectrum following the radiactive decay of <sup>124</sup>I, normalized for 1 radioactive decay.



Fig. 4 Calculated Auger electron spectrum following the radiactive decay of <sup>125</sup>I, normalized for 1 radioactive decay.

Tables 3, 4 and 5 show the Auger electron energies and emission yields for <sup>123</sup>I, <sup>124</sup>I and <sup>125</sup>I 194 decay, respectively, as calculated by means of the Geant4 simulation described in section 2.3, 195 196 the Geant4Lib analytical code, BrIccEmis [4], Pomplun [45] and Stepanek [27].

- 197
- 198

Table 3. Mean Auger electron energies and emission yields per decay calculated for  $^{123}$ l.  $\overline{E}$ 

199

is the mean energy of the transition as calculated in equation 1.

Line	Geant4 simulation		Geant4Lib Analytical Code		BrlccEmis [4]		Pomplun [45]	
	Ē (keV)	Yield	Ē (keV)	Yield	Ē (keV)	Yield	Ē (keV)	Yield
Auger MXY	0.435	2.286	0.453	1.946	0.411	1.94	0.394	1.93
Auger LMM	3.067	0.653	3.085	0.734	3.047	0.733	3.028	0.711
Auger LMX	3.565	0.305	3.679	0.208	3.675	0.206	3.656	0.200
Auger KLL	22.666	0.0807	22.665	0.0807	22.525	0.0805	22.52	0.0731
Auger KLX	26.505	0.0355	26.506	0.0355	26.456	0.0354	26.43	0.0328
Auger KXY	30.348	0.00375	30.346	0.00374	30.312	0.00362	30.30	0.00280
Auger total	0.499	14.89	0.529	13.67	0.933	7.39	-	7.3
Auger above 500 eV	-	1.30	-	1.29	-	1.27	-	-

200

201

Table 4. Mean Auger electron energies and emission yields per decay calculated for  $^{124}$ I.  $\overline{E}$ is the mean energy of the transition as calculated in equation 1. 202

Line	Ge simu	ant4 Ilation	Gea Analyti	nt4Lib cal Code	BrlccEmis [4]		
Line	Ē (ke∨)	Yield	Ē (keV)	Yield	Ē (ke∨)	Yield	
Auger MXY	0.435	1.533	0.453	1.306	0.413	1.30	
Auger LMM	3.086	0.491	3.085	0.492	3.048	0.492	
Auger LMX	3.680	0.135	3.679	0.139	3.676	0.138	
Auger KLL	22.666	0.0538	22.665	0.0541	22.525	0.0539	

Auger KLX	26.506	0.0239	26.506	0.0238	26.460	0.0240
Auger KXY	30.348	0.00250	30.346	0.00251	30.308	0.00256
Auger total	0.499	9.99	0.528	9.17	0.922	5.04
Auger above 500 eV	-	0.87	-	0.87	-	0.85

Table 5. Mean Auger electron energies and emission yields per decay calculated for <sup>125</sup>I.  $\overline{E}$  is

205 the mean energy of the transition as calculated in equation 1 and Yield is Y<sub>total</sub> of eq. 1.

line	Geant4 simulation		Gea Analyti	nt4Lib ical Code	Bricci	Emis [4]	Stepanek [27]		
	Ē (keV)	Yield	Ē (keV)	Yield	Ē (keV)	Yield	Ē (keV)	Yield	
Auger MXY	0.435	3.800	0.453	3.224	0.408	3.20	0.380	3.24	
Auger LMM	3.093	1.228	3.090	1.218	3.047	1.21	3.01	1.22	
Auger LMX	3.692	0.331	3.684	0.345	3.676	0.339	3.63	0.339	
Auger KLL	22.666	0.1286	22.665	0.129	22.522	0.129	22.6	0.126	
Auger KLX	26.506	0.0568	26.506	0.0566	26.454	0.0565	26.5	0.0580	
Auger KXY	30.349	0.00604	30.346	0.00597	30.322	0.00595	30.3	0.00550	
Auger total	0.490	24.85	0.519	22.81	0.953	11.8	-	8.92	
Auger above 500 eV	-	2.15	-	2.14	-	2.08	-	-	

#### 206

207 In reference to Fig. 2, 3 and 4, the Auger electron lines can be separated according to the 208 atomic shell of the initial vacancy: above 20 keV for the K-shell, 2–5 keV for the L-shells, 0.2– 209 1 keV for the M-shells, and below 0.2 keV for the remaining outer electron shells. It can be 210 observed that the Auger electrons spectra calculated with Geant4 and BrIccEmis are similar 211 from 500 eV to higher energies. For lower energies, the two theoretical approaches show 212 differences in the calculation of the yields. In particular, Geant4 calculates higher Auger yields 213 than BrIccEmis for all the radionuclides considered. It was also noticed that the major 214 contribution to Auger emissions with energy below ~500 eV derives from N shell transitions. 215 These discrepancies between the two theoretical approaches should be compared with 216 absolute N-shell Auger electron transition rates, however we are not aware of the existence 217 of suitable experimental data.

Table 3 shows the Auger electron energies and emission yields for <sup>123</sup>I decay as calculated by means of BrIccEmis [4], Pomplun [45] and Geant4. Geant4 calculates by default the full decay

chain, therefore the decay of <sup>123</sup>Te was switched off in the simulation, in order to compare 220 221 the same physical quantity against the other data. The Geant4 simulation results agree with 222 the Geant4Lib analytical code data in terms of Auger electron kinetic energies and in terms of 223 radiation yields with 4%, apart from the case of the radiation yield of the MXY, LMM and LMX 224 lines (17%, 11% and 46% of difference, respectively). This difference is ascribed to the 225 difficulty to identify the yields of specific lines in the Geant4 simulation using the methodology 226 described in 2.3 because of the overlapping of some group lines (see Figure 1). Apart from 227 this discrepancy, the results show consistency between the Geant4 simulation output and the 228 Geant4 data libraries used as input to describe Auger emission from radioactive decay, as 229 expected.

- 230 In terms of both energy and radiation yield, BrIccEmis [4] agrees within 1% with the Geant4 231 data libraries, apart from the case of Auger electron kinetic energies of MXY line where an 232 agreement within 9% has been observed and from the case of the radiation yield of the KXY 233 line where a difference of 5% was found. For Pomplun [45], an agreement within 2% with 234 Geant4 data libraries was found in terms of Auger electron kinetic energies, apart from 12% 235 difference for MXY line. In terms of radiation yield, there is an agreement within 10% apart from the case of the KXY line where a difference of 25% was found. The total emission yield 236 237 above 500 eV shows a very good agreement for Geant4Lib analytical code and Geant4 238 simulation (within 1%) and BrIccEmis [4] (within 2%).
- Table 4 displays the Auger electron energies and emission yields for <sup>124</sup>I decay calculated by 239 means of Geant4 and BrIccEmis [4]. The Geant4 simulation results agree with the Geant4Lib 240 241 analytical code data in terms of Auger electron kinetic energies within 1% for all lines, apart 242 from the case of MXY line where an agreement within 5% was found. In terms of emission yields, Geant4 simulation results are consistent with Geant4Lib analytical code, apart from a 243 17% difference for the MXY line. As in the case of <sup>123</sup>I, we ascribe the difference to the 244 difficulty to determine the transition line (see Section 2.3 and Figure 1), complicated by the 245 overlapping of the Auger emission energies. BrIccEmis [4] agrees with Geant4 data libraries 246 247 within 1%, apart from the case of MXY line where an agreement within 8% has been observed. 248 With regard to the total emission yield above 500 eV, there is excellent agreement between 249 the Geant4 simulation and the Geant4Lib analytical code (within 0.5%), as expected. 250 Agreement within 3% was found between the Geant4 data libraries and BrIccEmis [4].

Table 5 reports the Auger electron energies and emission yields for <sup>125</sup>I decay calculated by 251 252 means of Geant4, BriccEmis [4] and Stepanek [27]. In terms of Auger electron energy, Geant4 simulation results agree within 1 % with the Geant4 data libraries, apart from the case of the 253 254 MXY line (within 5%) and the total Auger electron emission. The differences are ascribed to 255 the difficulty to identify some lines (see Fig. 1), which is further complicated by a slight 256 broadening of the Auger electrons kinetic energies due to the momentum transfer to the 257 nuclear recoil. The Geant4 data libraries agree with BrlccEmis within 1% apart from the MXY 258 line (10%) and when considering the full spectrum of the Auger electrons. In terms of emission 259 yields, Geant4 simulation results are consistent with the Geant4Lib analytical code apart from 260 the case of MXY line, where differences up to 18% have been observed. This difference again 261 should be due to the method to distinguish the transition lines in the Geant4 simulation. 262 BrlccEmis [4] agrees with Geant4 data libraries within 2%. Besides, Stepanek [27] agrees 263 within 3% with Geant4 data libraries, while 17% difference has been noticed in terms of Auger electron kinetic energies. In the matter of the total emission yield above 500 eV, there was 264 265 an excellent agreement (within 0.5%) between the Geant4 data libraries and the Geant4

simulation. An agreement within 3% was found between the Geant4 data libraries andBrIccEmis [4].

These results show, as expected, agreement between the Geant4 simulation and the Geant4Lib analytical code. Eventual disagreement is ascribed to the difficulty to identify the yields of specific lines in the Geant4 simulation. In addition, the results show an agreement within few percent between BrIccEmis [4], Stepanek [27] data and the Geant4Lib analytical code. Pomplun [45] data show less agreement with Geant4 and BrIccEmis [4].

### 273 **3.2.** Comparison with experimental data

Fig. 5 shows the yield per <sup>125</sup>I decay for K Auger electrons using Geant4, BrIccEmis [4] and Pomplun [26] data compared with the experimental results performed at ANU [8]. Fig. 6 shows the ratio of the Auger electron emission yield calculated by either Geant4 or BrIccEmis [4] and the experimental results [8]. Fig. 7 shows the comparison of the Auger electron emission yield of <sup>131</sup>Cs decay calculated by means of Geant4, BrIccEmis [4] and the experimental data [43]. Fig. 8 illustrates the ratio of the emission yields calculated by either Geant4 simulation or BrIccEmis [4] and the experimental results [43].



Fig. 5 Comparison of the Auger electron yields calculated by means of Geant4, BrlccEmis [4], and Pomplun [26] with experimental data [8] for KLL peaks in the case of <sup>125</sup>I decay.



Fig. 6 Ratio of the Auger emission yield calculated by means of either Geant4, BrIccEmis [4], and Pomplun [26] and the experimental data [8]. The ratio has been calculated for KLL peaks in the case of <sup>125</sup>I decay.

Table 6. <sup>125</sup>I Auger electron yield calculated by means of Geant4, BrIccEmis [4], [8], Pomplun
 [26] and experimental data [8]. The experimental energy data have an uncertainty of around
 10 eV. The intensities are normalised to the KL2L3 line.

Line	Geant4 simulation		Geant4Lib Analytical Code		BrlccEmis [4]		Pomplun [26]		Experimental [8]				
	Energy (keV)	Yield	Energy (keV)	Yield	Energy (keV)	Yield	Energy (keV)	Yield	Energy (keV)	Yield			
KL1L1( <sup>1</sup> S <sub>0</sub> )	21.9765	0.309	21.9765	0.309	21.868	0.263	21.803	0.319	21.800(5)	0.262(5)			
KL1L2( <sup>1</sup> P <sub>1</sub> )	22 27 2725	22 2225	P <sub>1</sub> )	2( <sup>1</sup> P <sub>1</sub> )	0.267	22 222	0.267	22.210	0.207	22 151	0.284	22.128(5)	0.296(10)
KL1L2( <sup>3</sup> P <sub>0</sub> )	22.2725	0.367	22.2725	0.507	22.210	0.397	22.151	0.364	22.151(10)	0.086(6)			
KL1L3( <sup>3</sup> P <sub>1</sub> )	22.5515	0.459	22.5515	0.460					22.390(5)	0.309(7)			
KL1L3( <sup>3</sup> P <sub>2</sub> )+ KL2L2( <sup>1</sup> S <sub>0</sub> )	22.5685	0.047	22.5685	0.047	22.490	0.457	22.415	0.454	22.423(5)	0.153(6)			
KL2L3( <sup>1</sup> D <sub>2</sub> )	22.8475	1.000	22.8475	1.000	22.792	1.000	22.737	1.000	22.702(3)	1.000			

KL3L3(³P₀)	23.1255	0 504	22 1255	0 5 0 4	22.069	0 426	22.070	0 5 1 4	22.948(10)	0.071(6)
KL3L3( <sup>3</sup> P <sub>2</sub> )		0.504	23.1255	0.504	23.000	0.430	22.970	0.514	22.995(4)	0.364(7)



Fig. 7 Comparison of the Auger electron yields calculated by means of Geant4 and BrlccEmis [4] with experimental data [43] for Auger electron KLL peaks produced by <sup>131</sup>Cs decay.



Fig. 8 Emission yield's ratio calculated dividing the results obtained with either Geant4 or BrlccEmis [4] and the experimental data [43]. The ratios are shown for Auger electron KLL peaks produced by <sup>131</sup>Cs decay.

290Table 7. 131Cs Auger electron yield calculated by means of Geant4 and BrIccEmis [46], and291experimental yield [43].

Line	Geant4 simulation		Geant4Lib Analytical Code		BriccEr	nis [46]	Experimental [43]		
	Energy (keV)	Yield	Energy (keV)	Yield	Energy (keV)	Yield	Energy (keV)	Yield	
KL1L1( <sup>1</sup> S <sub>0</sub> )	23.722	0.328	23.722	0.329	23.521	0.330	23.526(6)	0.269(5)	
KL1L2( <sup>1</sup> P <sub>1</sub> )	24 025	0 201	24.025	0.200	22.070	0 270	23.875(8)	0.287(5)	
KL1L2( <sup>3</sup> P <sub>0</sub> )	24.035	0.391	24.035	0.350	23.870	0.375	23.906(12)	0.100(5)	
KL1L3( <sup>3</sup> P <sub>1</sub> )	24.364	0.472	24.364	0.470	24.200	0.471	24.181(14)	0.256(41)	
KL2L2( <sup>1</sup> S <sub>0</sub> )	24.348	0.047	24.348	0.048	24.178	0.047	24.187(18)	0.121(41)	
KL1L3( <sup>3</sup> P <sub>2</sub> )	-	-	-	-	-	-	24.232(10)	0.110(5)	
KL2L3( <sup>1</sup> D <sub>2</sub> )	24.677	1.000	24.677	1.000	24.516	1.000	24.522(20)	1.000	

KL3L3( <sup>3</sup> P <sub>0</sub> )	25.007	0 501	25.007	0 500	24 020	0 409	24.850(12)	0.074(5)
KL3L3( <sup>3</sup> P <sub>2</sub> )	23.007	0.501	23.007	0.500	24.030	0.498	24.857(6)	0.346(5)

293 Table 6 shows the <sup>125</sup>I Auger electron energies and yields obtained with Geant4 simulation, 294 Geant4Lib analytical code, BrIccEmis [4] and Pomplun [26] models and the experimental data 295 [8]. The experimental spectrum and theoretical peaks are scaled to match the intensity of the 296 Geant4 KL2L3 Auger line. Good agreement in terms of Auger electron yield was found among 297 Geant4, the experimental data and the other theoretical calculations. Geant4 simulations 298 gave the same results of the Geant4Lib analytical code. Regarding to the emission yields of 299 the experimental data [8] (see Fig. 5 and 6), an agreement within 15% (corresponding to the 300 Geant4 model uncertainty) was found in comparison to Geant4 and 20% agreement with 301 Pomplun [26]. In addition, a 5% agreement was found for BrIccEmis [4] in comparison to 302 experimental data.

303 A comparison has been performed for the experimental KLL Auger energy spectrum deriving from the decay of <sup>131</sup>Cs, measured by Kovalik et al [43], with the theoretical one calculated 304 305 using Geant4 simulation, Geant4Lib analytical code, and BrIccEmis [46]. The experimental spectrum and theoretical lines are scaled to match the intensity of the Geant4 KL2L3 Auger 306 line. Table 7 displays the <sup>131</sup>Cs Auger electron energies and yields obtained with Geant4 and 307 308 BrIccEmis [46] models and the experimental data. In terms of emission yields, good 309 agreement (within 3%) was observed between Geant4 and BrIccEmis [46] theoretical 310 calculations. Geant4 simulation results are consisted with the Geant4 data libraries. In Fig. 8, 311 differences up to 25% were observed between Geant4 and BrlccEmis against the experimental data [43]. The only exception is the KL2L2 line, where a ~250% discrepancy has 312 been noticed in comparison to the reference data [43], for both Geant4 and BrlccEmis. 313

314 In both comparisons (see Fig. 5 and 7), a kinetic energy shift (~150 eV) of the emission lines is 315 observed for the Geant4 results. This most likely comes from the fact that Auger electron 316 energies are derived from neutral binding energies (see Section 2.2). Moreover, the existing physics models describing atomic de-excitation of Geant4 disregard the quantum 317 318 electrodynamics (QED) and Breit magnetic electron interaction corrections which could cause 319 energy shift of the emitted Auger electrons and X-rays [46]. The QED effect is due to the fact 320 that an electron moving in the vacuum drags a cloud of virtual photons with it [47], [48]. 321 BrlccEmis has semi-empirical correction for these effects.

Another difference in the model calculations is the atomic structure effect (~10 eV), which is only included in BrIccEmis and arises due to the fast vacancy cascade in the atom when it rearranges itself according to the atomic ground state of the daughter. This effect is important especially for transitions involving K and L shells where the vacancies have short lifetimes  $(\sim 10^{-17} - 10^{-15} \text{ sec})$  [46].

# 327 **4. Conclusion**

In this work we benchmarked for the first time the emission of Auger electrons deriving from <sup>123</sup>I, <sup>124</sup>I, <sup>125</sup>I and <sup>131</sup>Cs decays calculated by means of Geant4 against other theoretical approaches (BrIccEmis [4], [46], Pomplun [26] and Stepanek [27]) and experimental results performed at the Australian National University (ANU) [8] and the Joint Institute for NuclearResearch (JINR) [43].

We verified the consistency between the Geant4 simulation results and the Geant4 data libraries, input to the Monte Carlo code, to calculate Auger electron kinetic energies and emission probabilities, deriving from atomic de-excitation after a radioactive decay.

336 When comparing Geant4 to other theoretical approaches, an overall good agreement, usually 337 within few percent in terms of Auger electron energies, was found between Geant4 and other 338 theoretical approaches. In terms of emission yields, a good agreement (within 3%) was found 339 for vacancies in the K shell. In the case of vacancies in the L and M shells, the level of 340 agreement was worse (within 15%) because it was difficult to determine the associated 341 transition lines in the Geant4 simulation. Overall, the total number of the Auger electron 342 emitted per radioactive decay was found significantly higher in Geant4. However, it was 343 noticed that the difference was mostly coming from the low energy range, below ~500 eV, where the Auger electrons derive mainly from vacancies in N shell. 344

When comparing Geant4 simulation results to experimental data, a shift in the Auger kinetic energies was found. This may be caused to limitations of the theoretical approach, which considers the energy level of neutral atoms only and disregards quantum electrodynamics (QED) effects, Breit magnetic electron interaction corrections and atomic structure effects. These differences are not observed in the latest version of BrlccEmis [4], as it recently adopted a semi-empirical correction, which reduces the difference between the calculated and experimental Auger line energies below 10 eV [29].

In terms of Auger electron emission yields, once the results were normalised to KL2L3 line, an
 agreement within 15% for <sup>125</sup>I and 25% <sup>131</sup>Cs radioactive decays, was found among Geant4,
 BrIccEmis [4] and the measured K Auger intensity.

For the future, we recommend extending the benchmarking to the conversion lines, other radioisotopes and to other sets of experimental measurements. As far as we know, this is the first time that the Geant4 Auger emission from radioactive decay of medical radioisotopes has been benchmarked against other theoretical approaches and validated against experimental measurements.

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