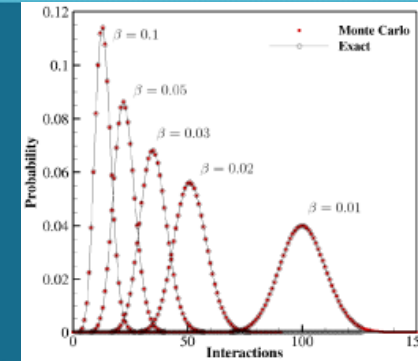




# Probability Distribution Functions of the Number of Scattering Collisions in Electron Slowing Down



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M&C 2021

The International Conference on Mathematics and Computational Methods  
Applied to Nuclear Science and Engineering

October 3-7, 2021



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## Derivation of Analytical Probability Distributions

- Exponential energy-loss model

## Numerical Probability Distributions

- Exponential energy-loss model
- Physics models
- Physics-informed exponential energy-loss models

Possible approaches for analytical models that better represent the physics

## Backward Master Equation for Collision-Number Probability



We begin with a backward master equation for the probability that a particle will experience  $n$  collisions in slowing down from energy  $E$  to below energy  $E_u$ .

$$P_n(E) = \tilde{f}_s(E) \delta_{n,1} + \int_{E_u}^E dE' f_s(E \rightarrow E') P_{n-1}(E') \quad 0 < E < \infty, \quad n = 0, 1, \dots$$

with  $P_n(E) = 0$  for  $n \leq 0$ .

The particle necessarily undergoes at least one interaction. It may undergo only one collision with the following probability:

$$\tilde{f}_s(E) = \int_0^{E_u} dE' f_s(E \rightarrow E')$$

This energy-loss distribution is related to the electron-electron differential scattering cross section.

$$\Sigma_s(E \rightarrow E') = \Sigma_s(E) f_s(E \rightarrow E')$$

# Discrete Transform to the Probability Generating Function



We use the discrete transform

$$G(z, E) = \sum_0^{\infty} z^n P_n(E) \quad |z| \leq 1$$

to convert the infinite set of coupled integral equations into a single integral equation, the probability generating function:

$$G(z, E) = z \tilde{f}_s(E) + z \int_{E_u}^E dE' f_s(E \rightarrow E') G(z, E')$$

## Analytical solution with exponential energy-loss scattering



To obtain an analytical solution for the pdf, we model the peaked differential cross section as an exponential function

$$\Sigma_s(E \rightarrow E') = \frac{\Sigma_0}{\beta} e^{-\frac{(E-E')}{\beta}}, \quad 0 \leq E' \leq E$$

For  $E_u \ll E$ , the energy-loss distribution terms are given approximately, to exponentially small terms, by

$$f_s(E \rightarrow E') = \frac{1}{\beta} e^{-\frac{(E-E')}{\beta}}$$

$$\tilde{f}_s(E) = e^{-\frac{(E-E_u)}{\beta}}$$

## Collision number distribution is almost Poisson for an exponential energy-loss distribution.



Since  $z$  appears only parametrically in the probability generating function

$$G(z, E) = z \tilde{f}_s(E) + z \int_{E_u}^E dE' f_s(E \rightarrow E') G(z, E')$$

this equation can be solved by converting it to a differential equation.

$$G(z, E) = z \left[ \frac{1}{\tilde{f}_s(E)} \right]^{z-1} = z \left( \frac{e^{\frac{E}{\beta}} - 1}{e^{\frac{E_u}{\beta}} - 1} \right)^{z-1}$$

$P_n(E)$  is recovered by expanding this solution for  $G$  in a series in  $z$  to obtain

$$P_n(E) = \frac{1}{\Gamma(n)} \left[ \ln \frac{1}{\tilde{f}_s(E)} \right]^{n-1} e^{-\ln \frac{1}{\tilde{f}_s(E)}}, \quad n \geq 1$$

This is almost a Poisson distribution with parameter  $\ln \frac{1}{\tilde{f}_s(E)}$  but with index  $n-1$  instead of  $n$ .

## Summary of the Collision Number Distribution with Exponential Energy-Loss Scattering



Again, the solution is

$$P_n(E) = \frac{1}{\Gamma(n)} \left[ \ln \frac{1}{\tilde{f}_s(E)} \right]^{n-1} e^{-\ln \frac{1}{\tilde{f}_s(E)}}, \quad n \geq 1$$

The mean and variance are

$$\bar{n}(E) = 1 + \ln \left[ \frac{1}{\tilde{f}_s(E)} \right] \quad V(E) = \ln \left[ \frac{1}{\tilde{f}_s(E)} \right] \approx \bar{n}(E)$$

Neglecting exponentially small terms, the model parameters can be related to the stopping power,  $S$ , and energy-loss straggling coefficient,  $T$ .

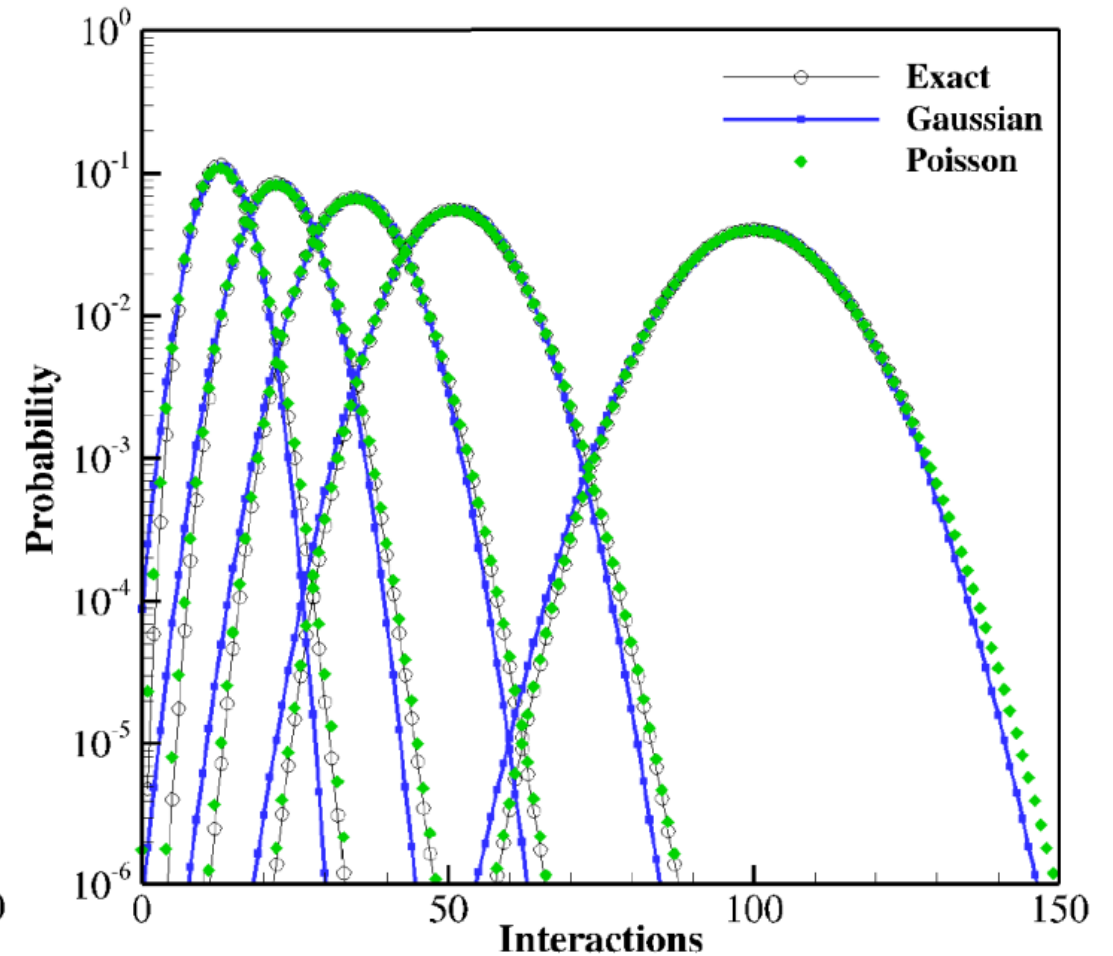
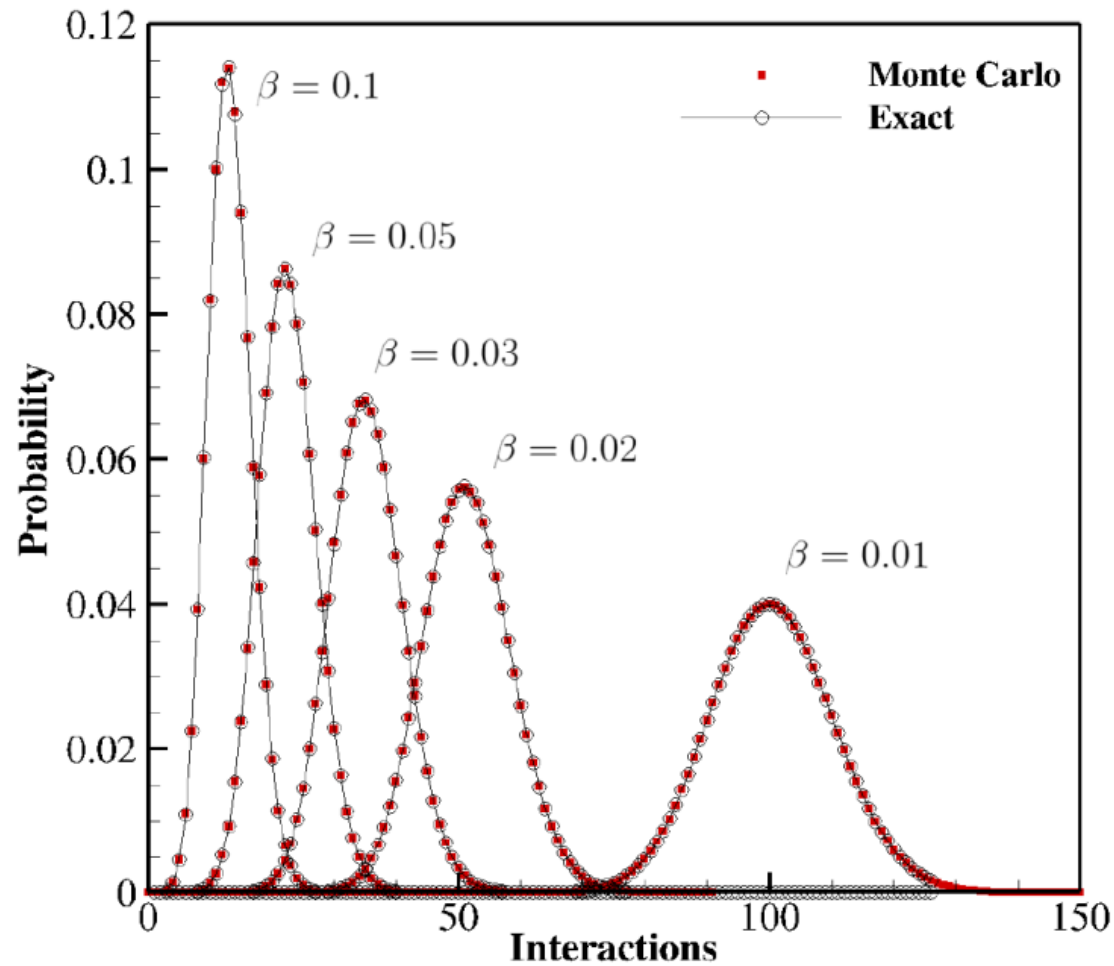
$$\beta = \frac{T}{2S}$$

$$f_s(E \rightarrow E') = \frac{1}{\beta} e^{-\frac{(E-E')}{\beta}}$$

$$\Sigma_0 = \frac{2S^2}{T}$$

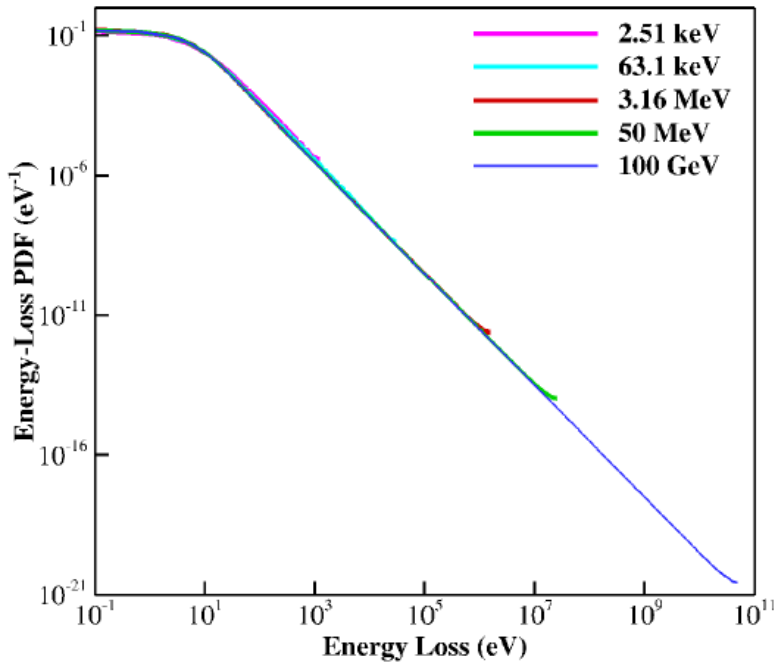
$$\tilde{f}_s(E) = e^{-\frac{(E-E_u)}{\beta}}$$

# Numerical Results with Exponential Energy Loss

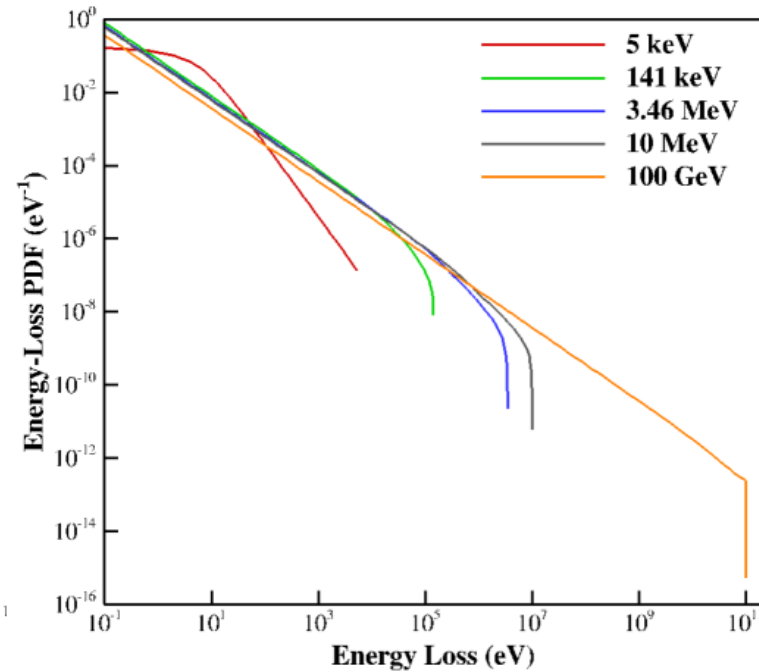




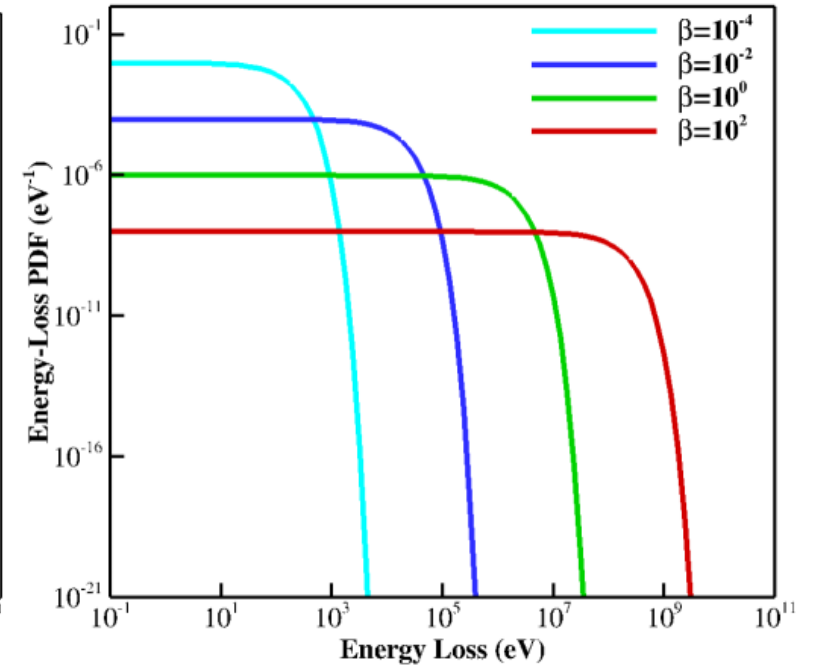
## Electro-ionization Energy-Loss



## Bremsstrahlung Energy-Loss



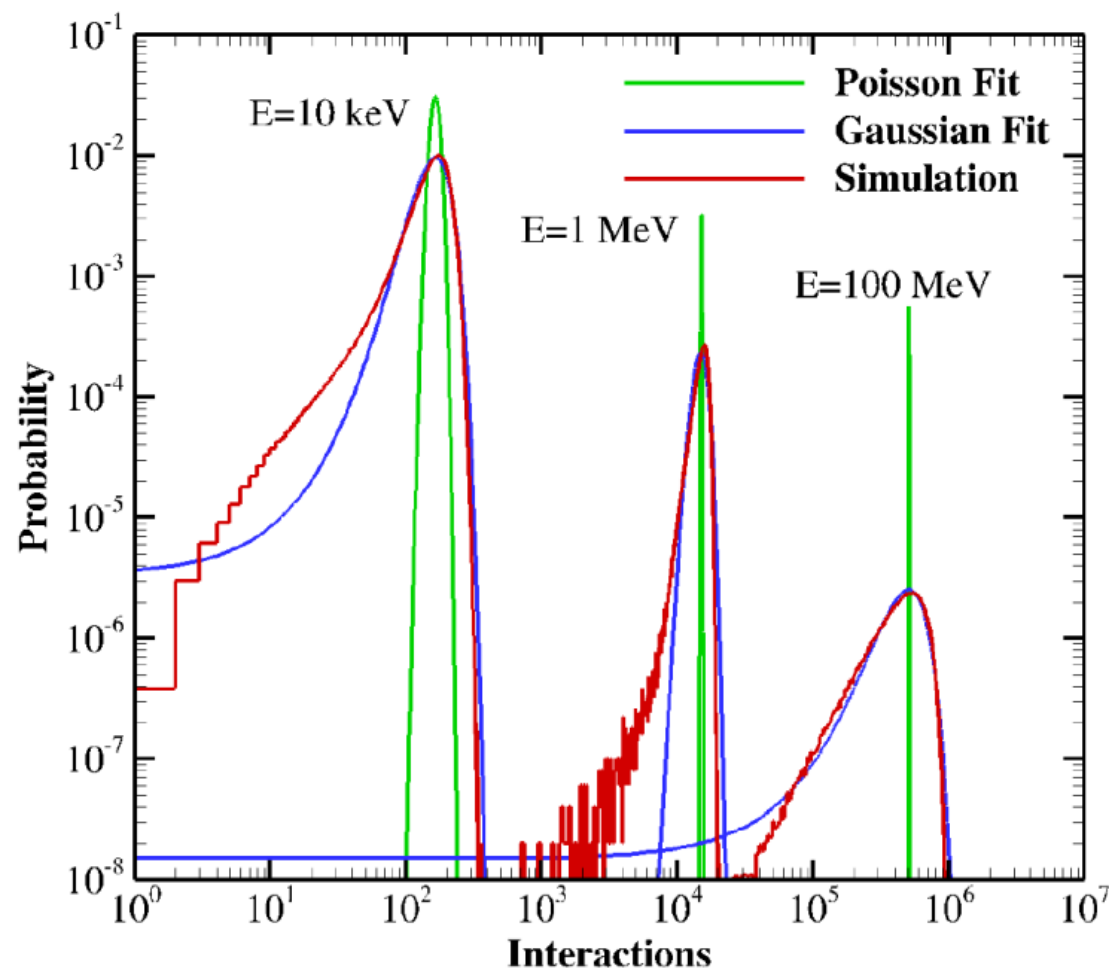
## Exponential Energy-Loss



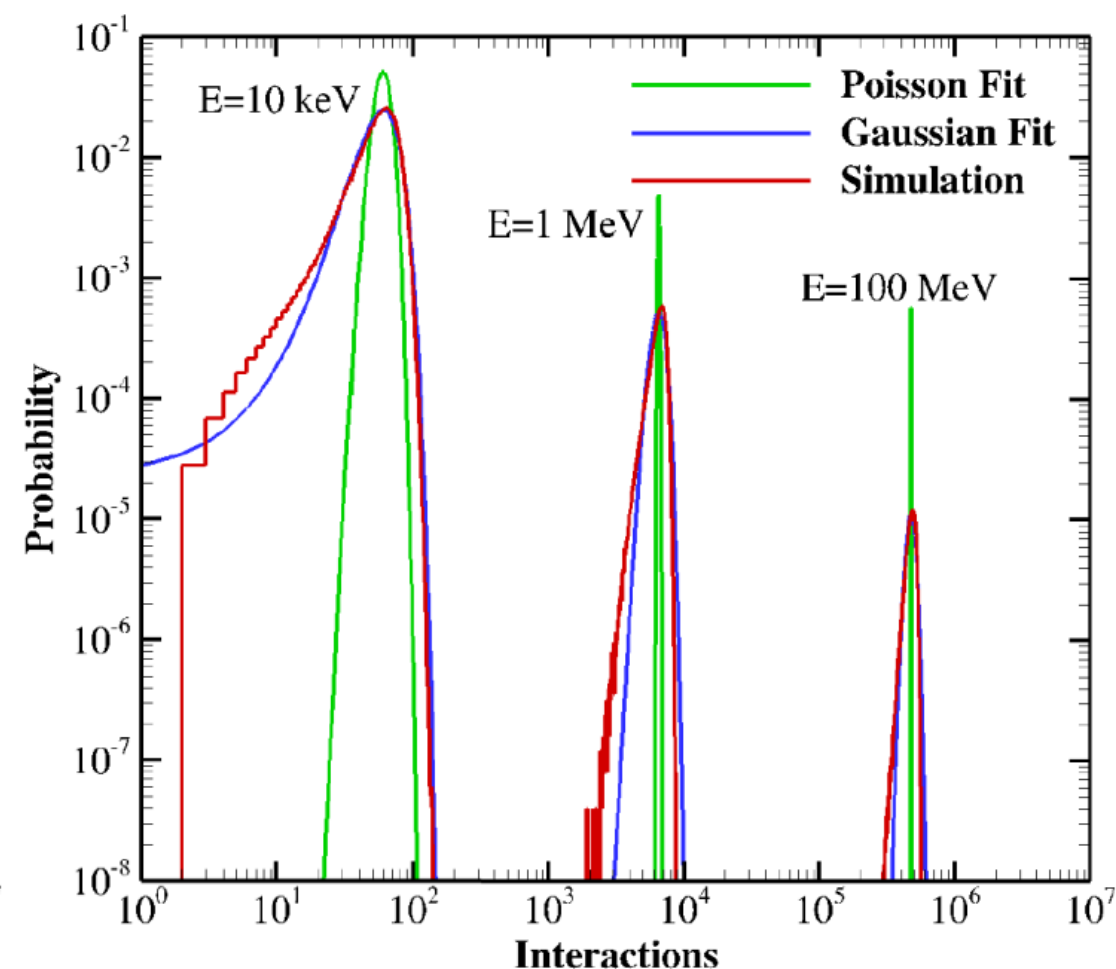
# Numerical Results with EEDL Electron Energy-Loss Models



## Full Electron Physics



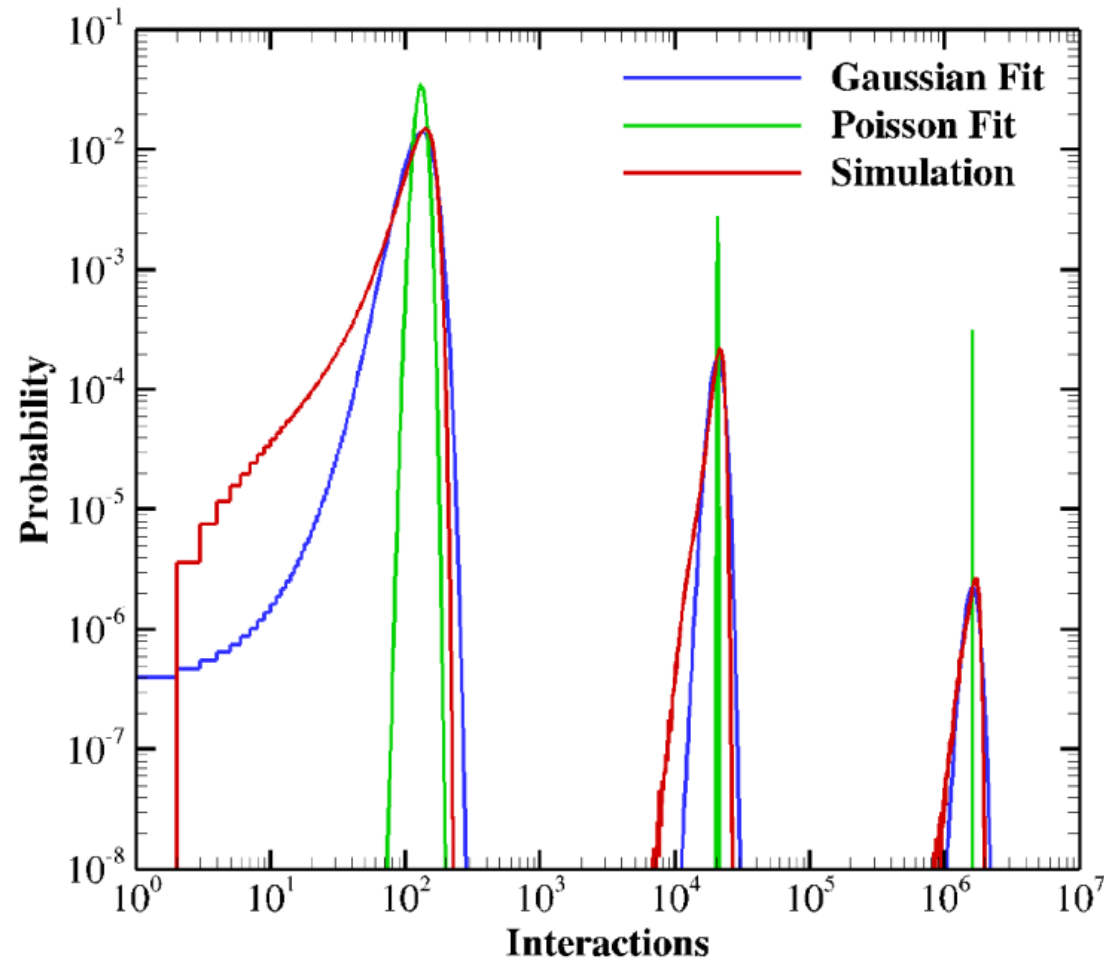
## Electro-Ionization Interactions Only



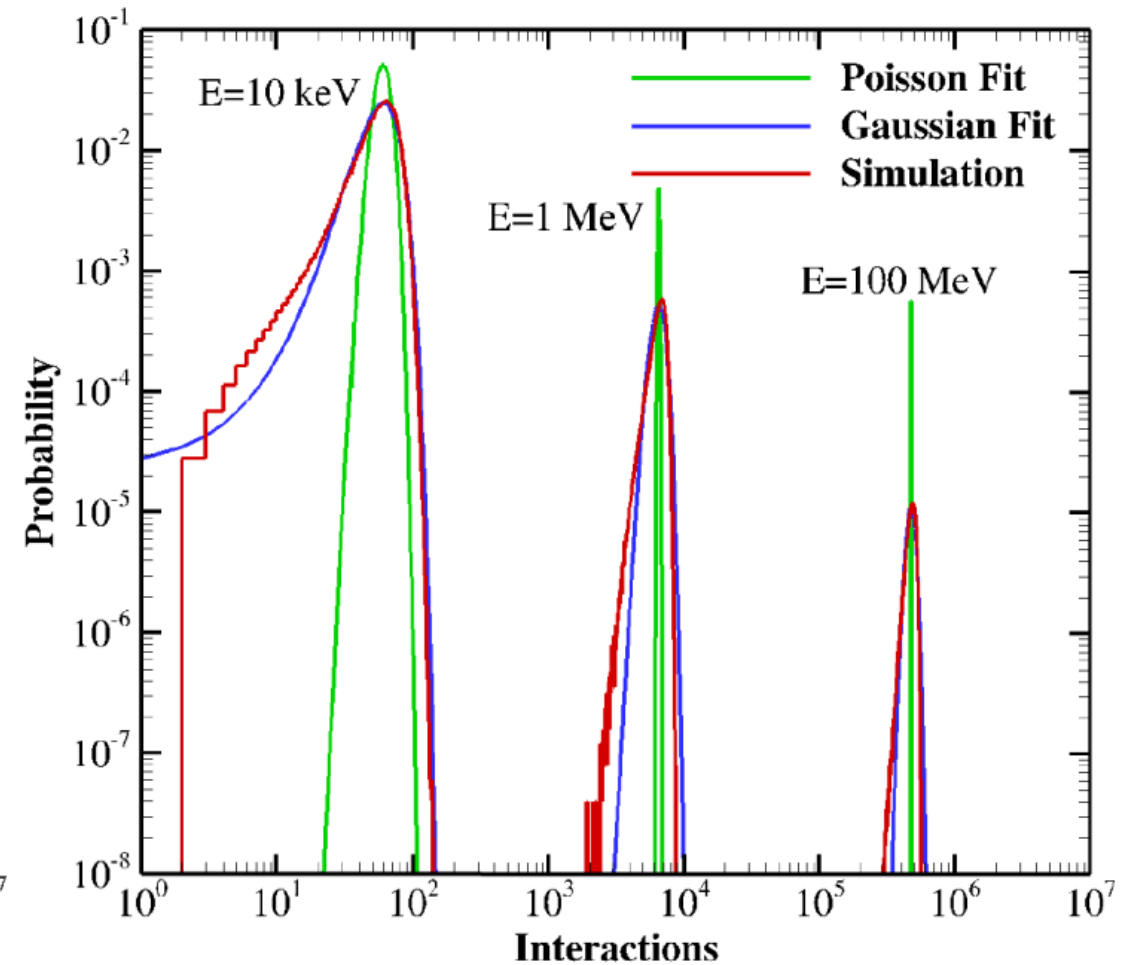
# Numerical Results with EEDL Electron Energy-Loss Models



Hydrogen Background Material

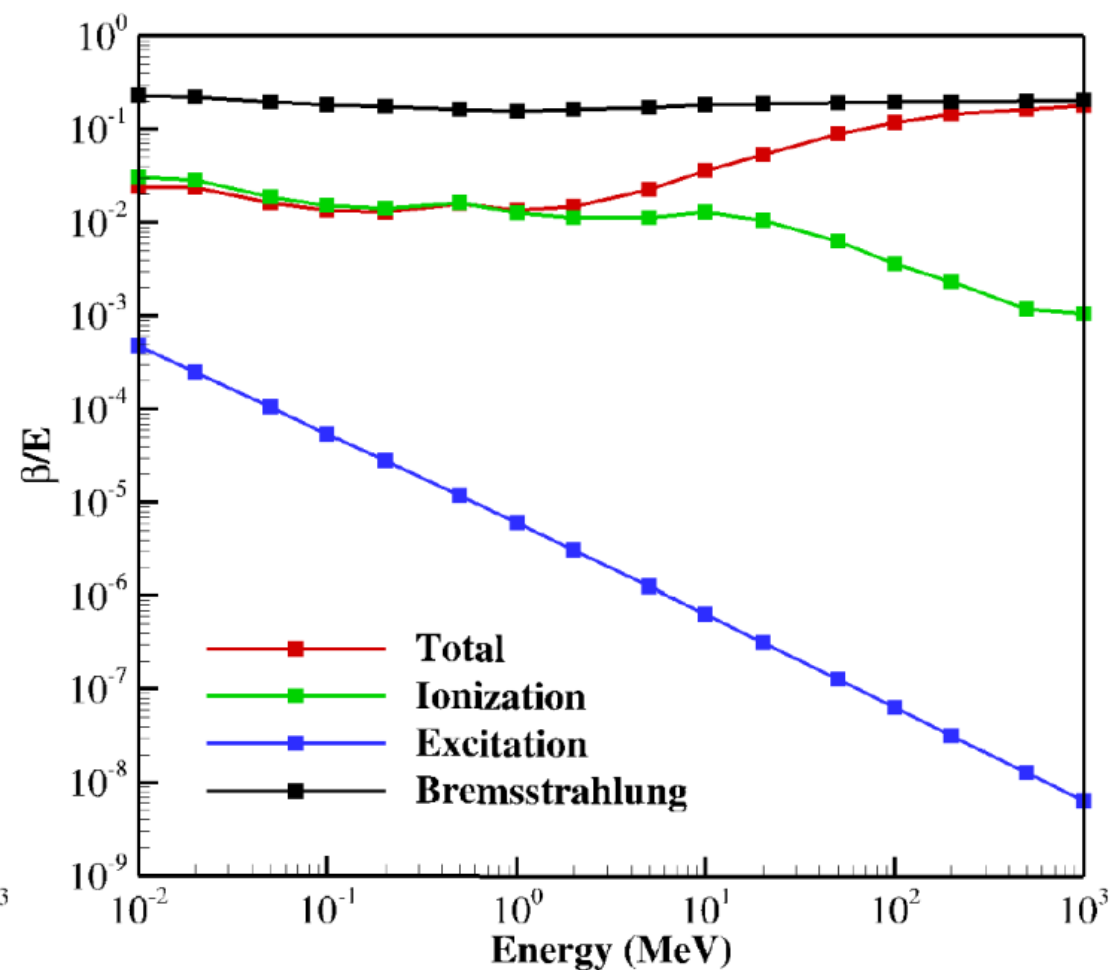
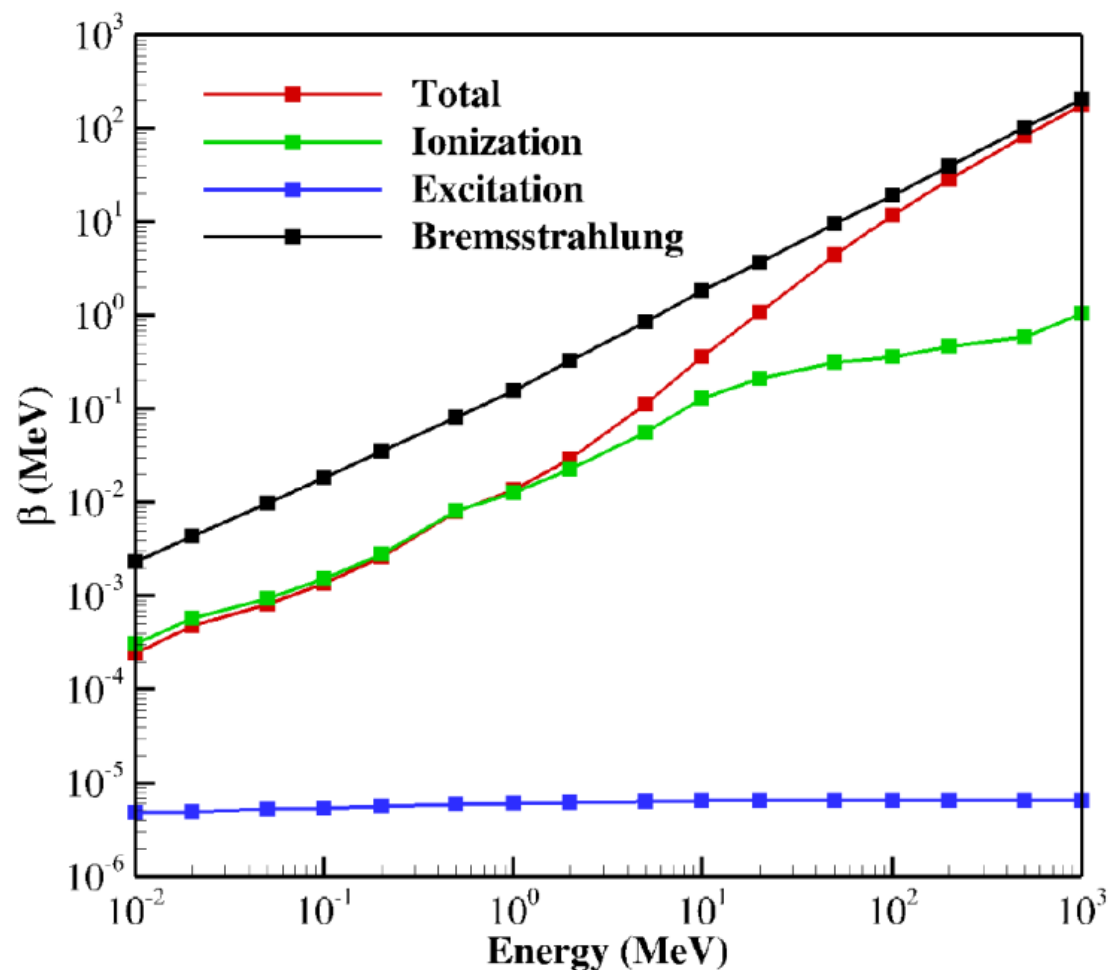


Aluminum Background Material



# Energy-Loss Parameter from Physics Models

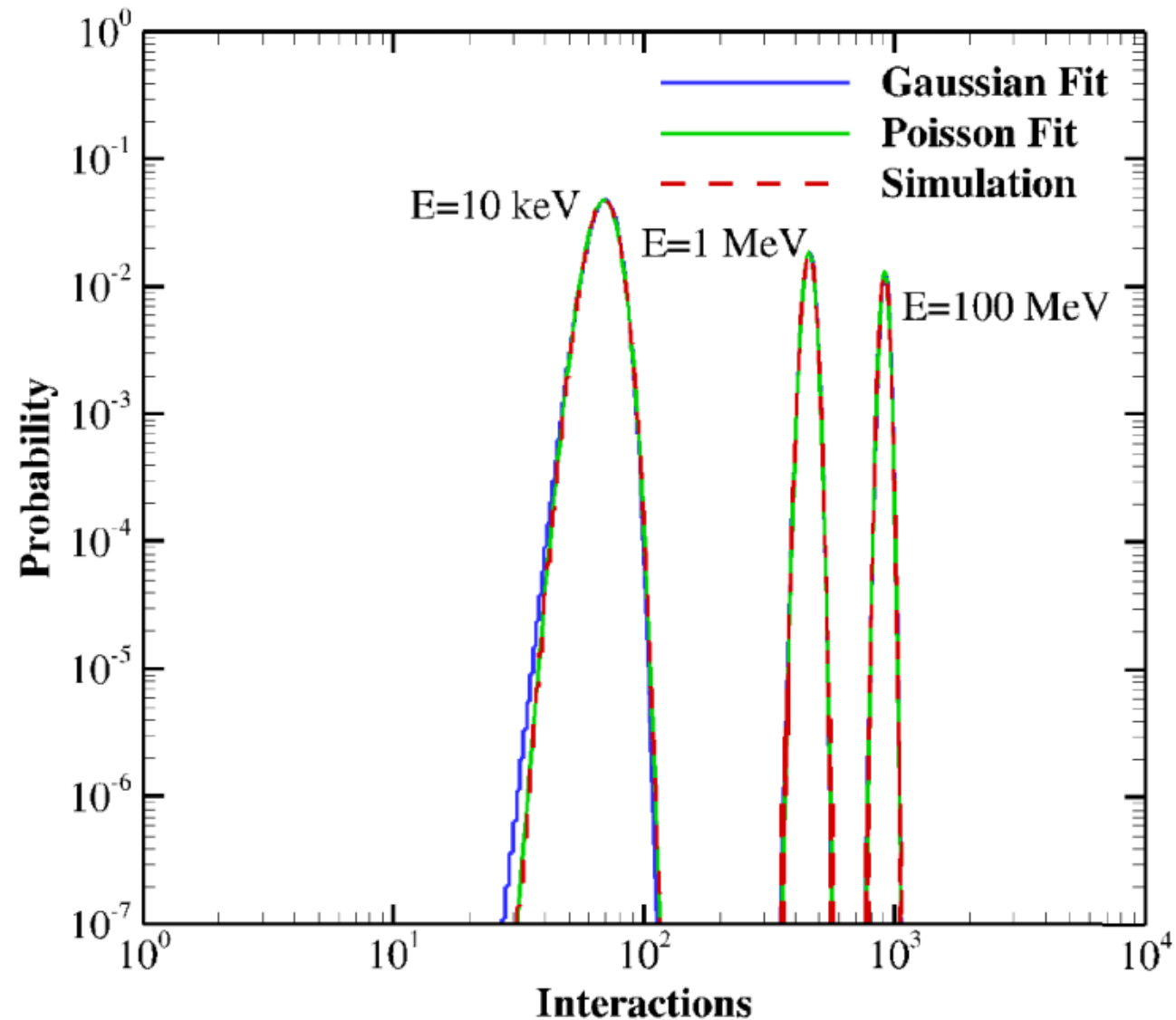
$$\beta = \frac{T}{2S}$$



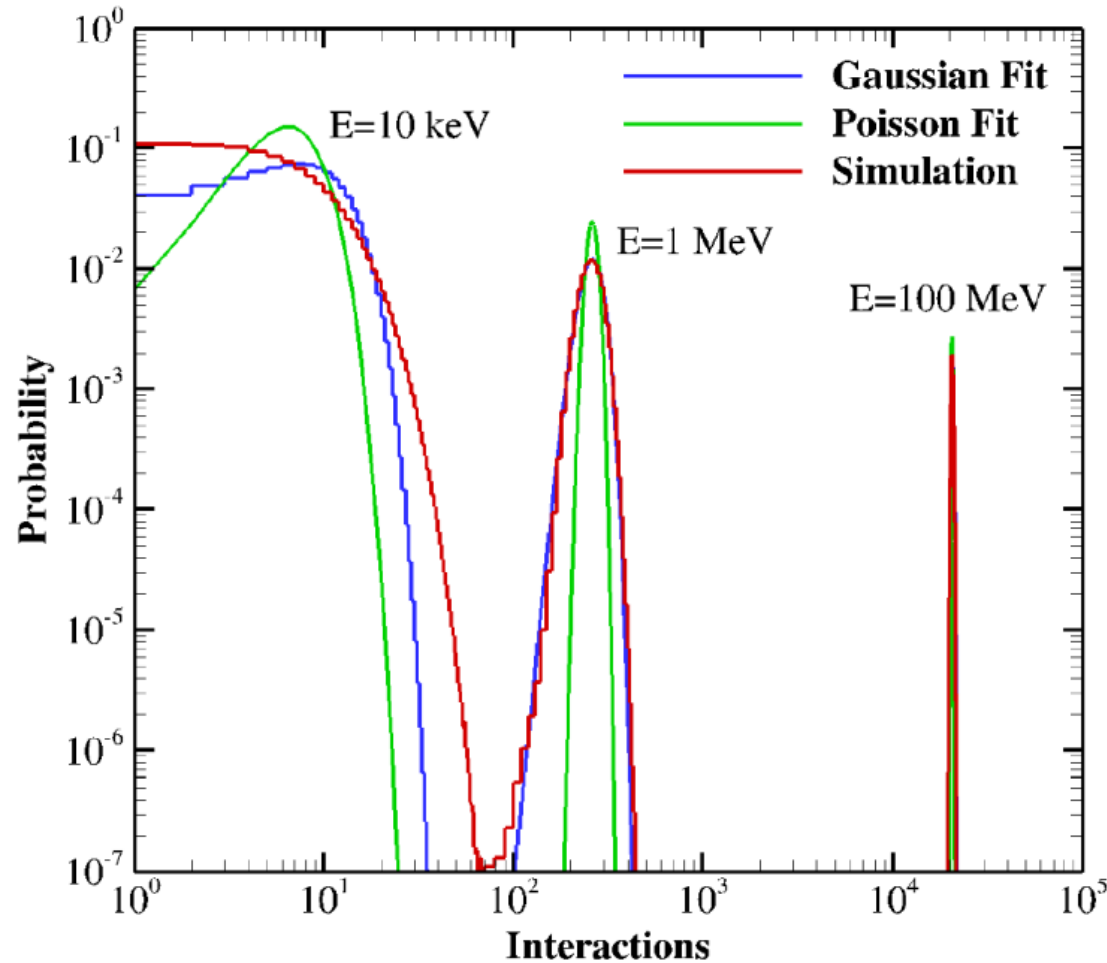
# Exponential Energy Loss with Energy-Dependent Parameter



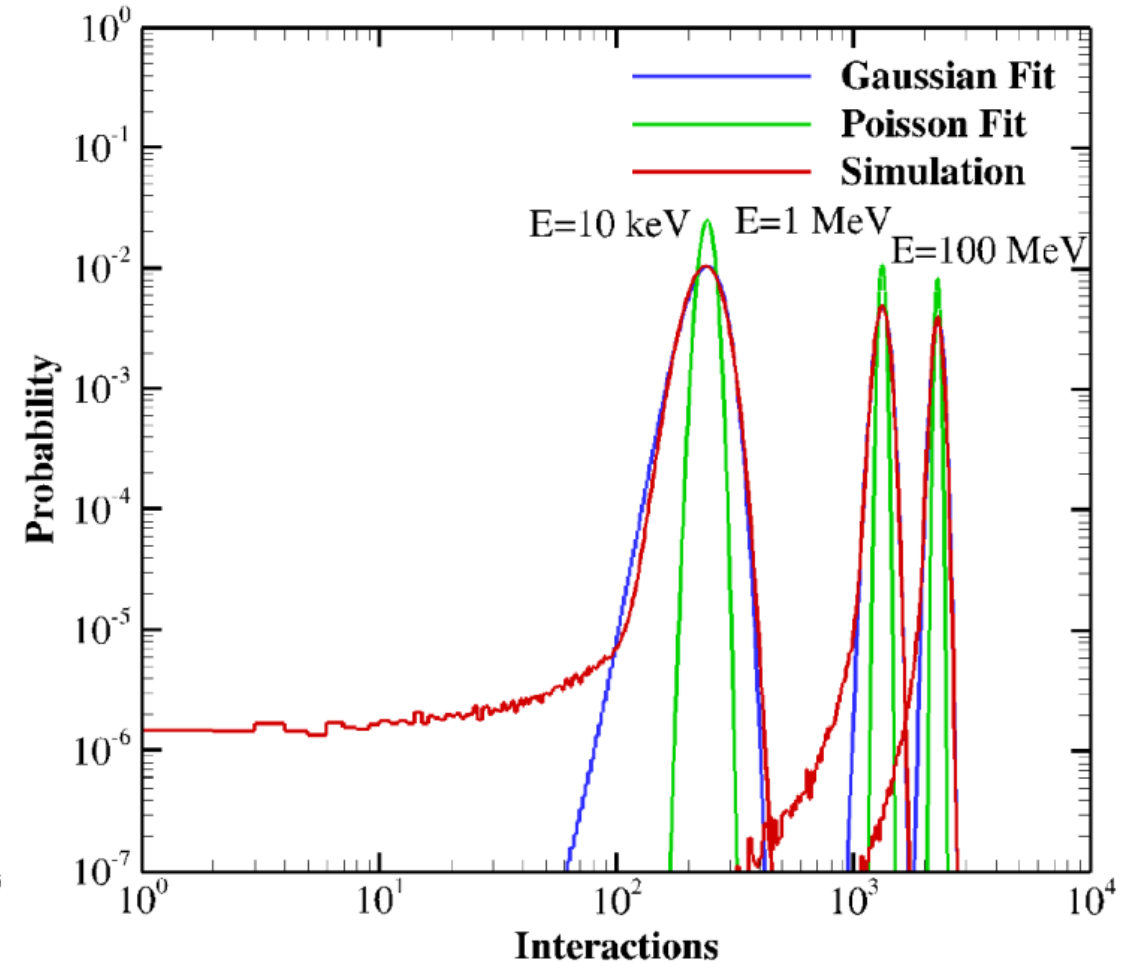
$$\beta = E/100$$



# Exponential Energy Loss with Mixed Parameter Values

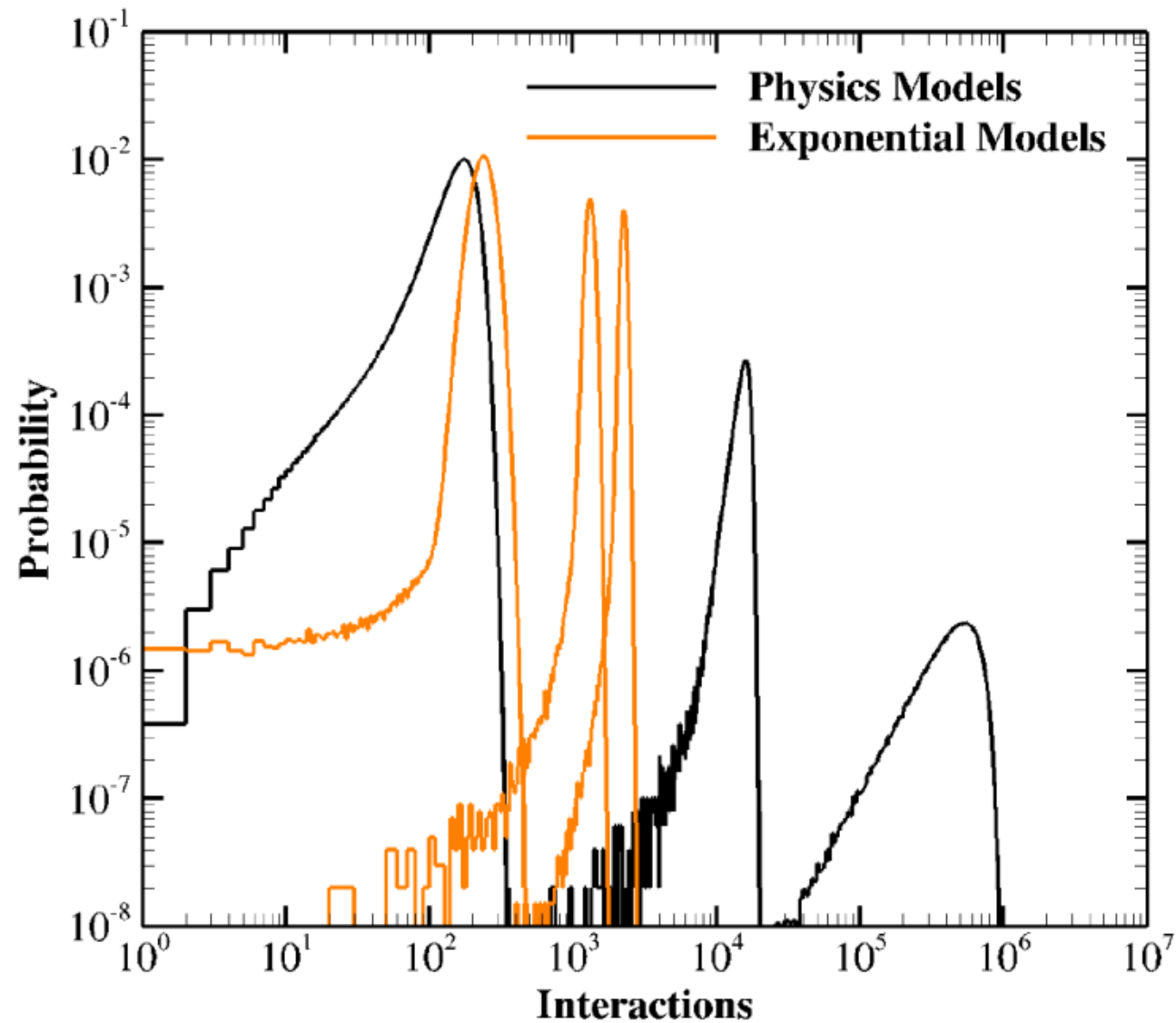


Electron ionization  $\beta = 0.01$   
 Bremsstrahlung  $\beta = 0.1$   
 Excitation  $\beta = 0.00001$

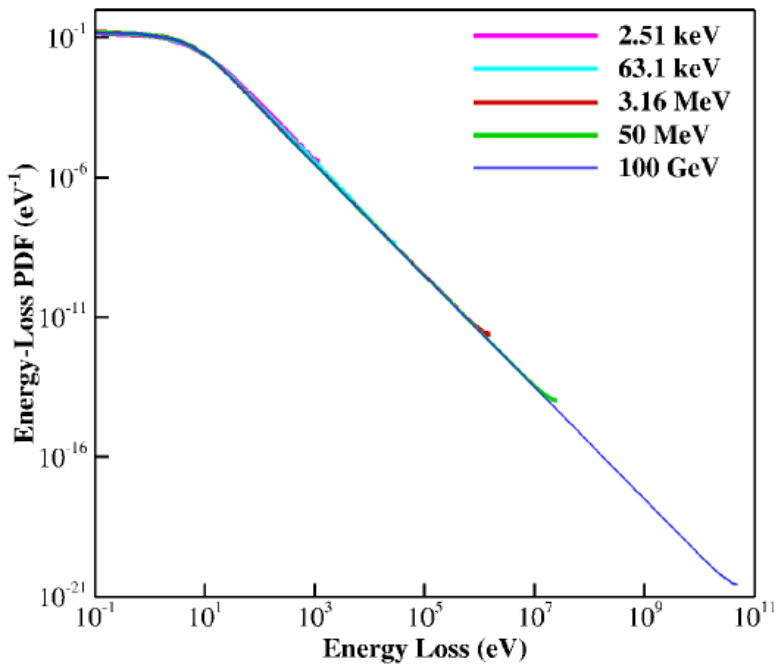


Electron ionization  $\beta = E/100$   
 Bremsstrahlung  $\beta = E/5$   
 Excitation  $\beta = E/10000$

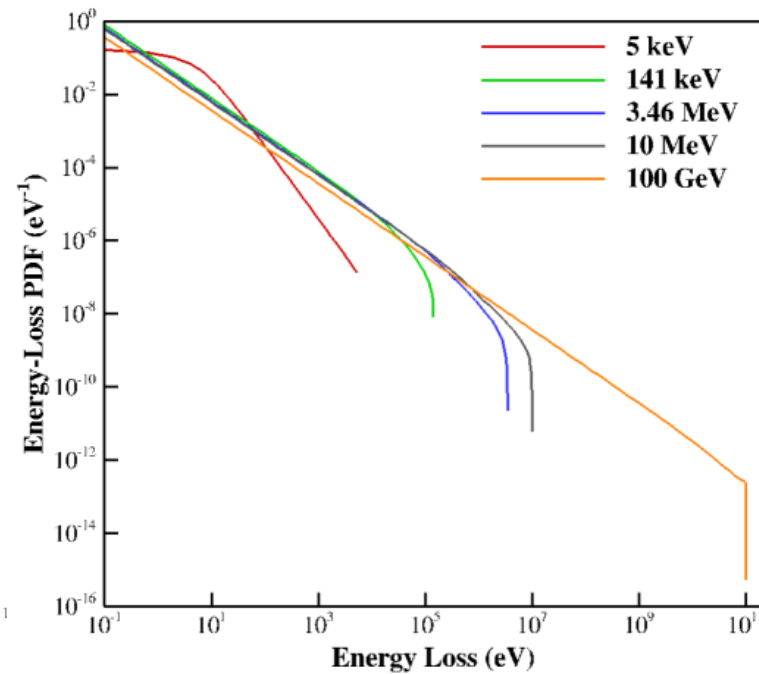
# Energy-Dependent Exponentials versus Physics Models



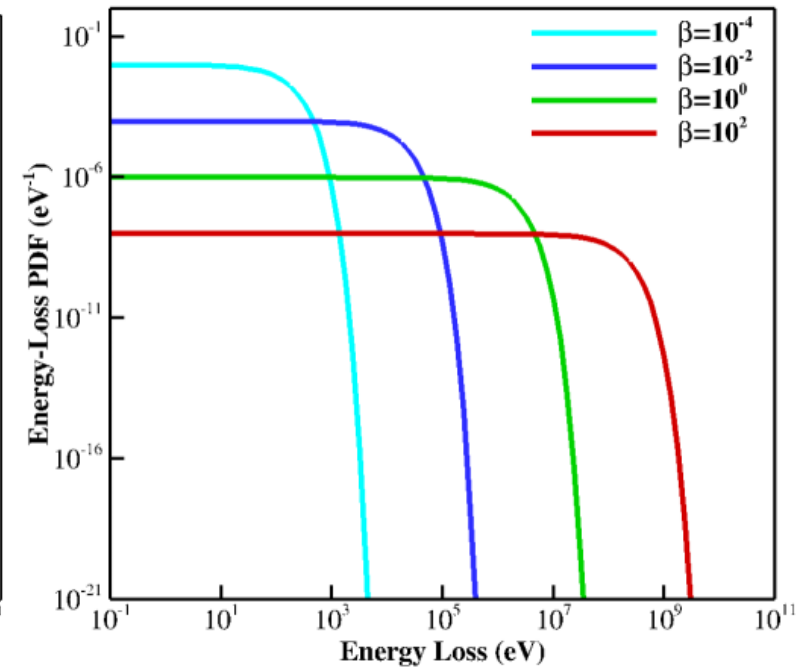
## Electro-ionization Energy-Loss



## Bremsstrahlung Energy-Loss



## Exponential Energy-Loss





# Conclusions



Starting from a backward Master equation, the analytical solution for collision-number probability distribution was derived based on an exponential energy-loss kernel.

The analytical result was shown to agree with Monte Carlo simulation results.

Comparisons were made with simulation results obtained using electron scattering models.

An analytical solution with a power-law energy-loss term or multiple exponential energy-loss terms could be more representative of the true physics of electrons.

$$P_n(E) = \frac{1}{\Gamma(n)} \left[ \ln \frac{1}{\tilde{f}_s(E)} \right]^{n-1} e^{-\ln \frac{1}{\tilde{f}_s(E)}}$$

