

# Detectors in Nuclear Physics: Monte Carlo Methods

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Lectures I-II



# INTRODUCTION

# What is Monte Carlo ?

(a mathematical method using random sampling)

- The **originators** : Von Neumann and Ulam 1949
- The **method** : Random sampling from pdf's to construct solutions to problems.



**John Von Neumann**  
(1903-1957)



**Stanislaw M. Ulam**  
(1909-1984)

# Why call it Monte Carlo?



After the city in the Monaco principality ...

# Sampling from a probability distribution

## Sampling from a generic distribution

- Using one random number
- Integrate the distribution function, analytically or numerically, and normalize to 1 to obtain the **normalized cumulative distribution**:

$$F(\xi) = \frac{\int_{x_{min}}^{\xi} f(x) dx}{\int_{x_{min}}^{x_{max}} f(x) dx}$$

- Sample a uniform pseudo-random number  $\xi$
- Get the desired result by finding the **inverse value**  $X = F^{-1}(\xi)$ , **analytically** or most often by **interpolation** (table look-up)

Since  $\xi$  is uniformly random, we have

$$P(a < x < b) = P(F(a) < \xi < F(b)) = F(b) - F(a) = \int_a^b f(x) dx$$

# Sampling from a probability distribution

## Example

take  $f(x) = e^{-\frac{x}{\lambda}}$ ,  $x \in [0, \infty]$

Cumulative distribution:

$$F(t) = \int_0^t e^{-\frac{x}{\lambda}} dx = \lambda \times (1 - e^{-\frac{t}{\lambda}})$$

Normalized:

$$F'(t) = \int_0^t \frac{e^{-\frac{x}{\lambda}}}{\lambda} dx = 1 - e^{-\frac{t}{\lambda}}$$

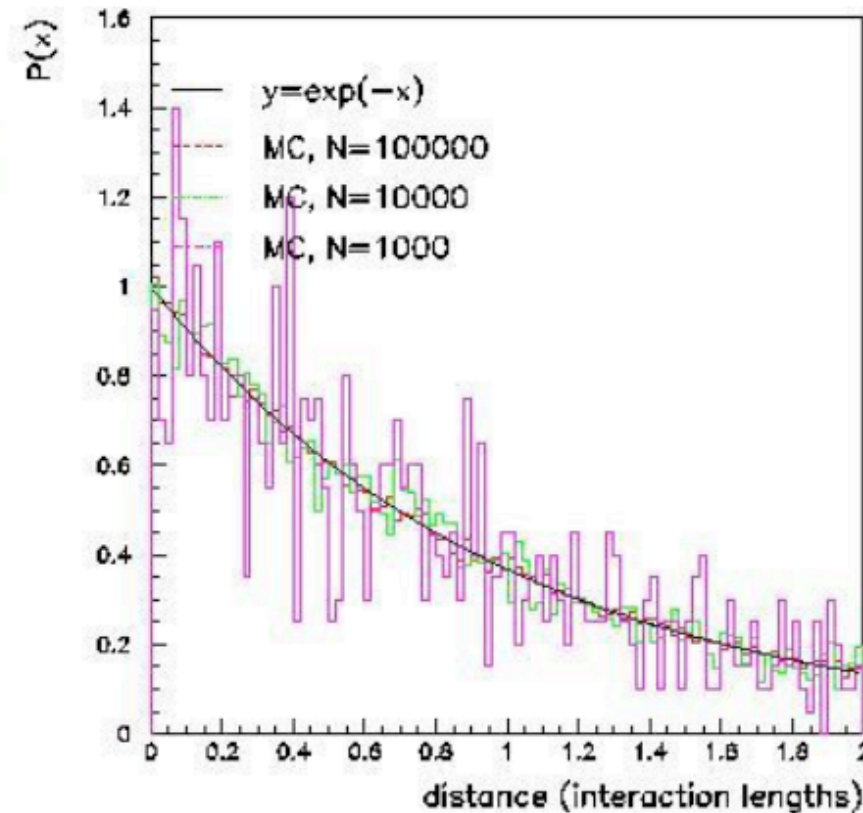
Sample a uniform  $\xi \in [0, 1]$

$$1 - e^{-\frac{t}{\lambda}} = \xi$$

sample  $t$  by inverting

$$t = -\ln(\xi - 1) \times \lambda$$

repeat  $N$  times



**Practical rule: a distribution can be sampled directly if and only if its pdf can be integrated and the integral inverted**

# Sampling from a distribution

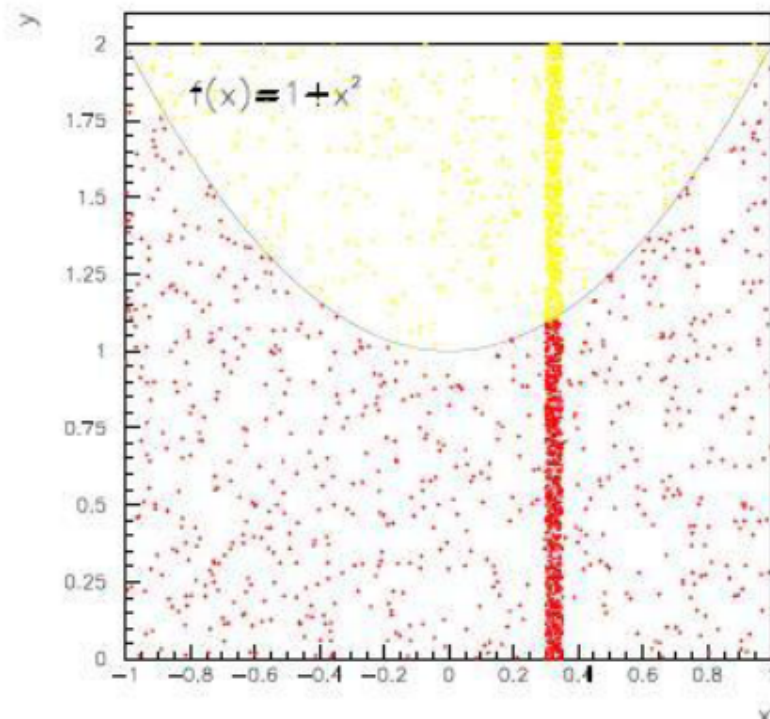
- Using two random numbers (rejection technique)
- Choose a constant value  $C > f(x)$  for any  $x$
- Sample two random numbers  $\xi_1$  and  $\xi_2$
- If  $\xi_2 < f(\xi_1)/C$ ,  $X = \xi_1$ ,  
otherwise re-sample  $\xi_1, \xi_2$

The probability that a  $\xi_1$  value is accepted is  $f(\xi_1)/C$  for any  $\xi_1$ :

$$P(x) dx = P(\xi_1 = x) dx \cdot f(\xi_1 = x)/C$$

Since  $P(\xi_1) dx = \text{const}$ ,

$$P(x) dx = \text{const} \cdot f(x)$$



# The problem of radiation transport

- ❖ Each particle is represented by a point in phase space  $\mathbf{P}=(\mathbf{r}, E, \boldsymbol{\Omega}, t)$
- ❖ Transport calculations are attempts to solve the Boltzmann Equation, i.e., a balance equation accounting for all “produced” (e.g., sources, “in-scattering”) and “destroyed” (e.g., absorption, “out-scattering”) particles at each point of the phase space
- ❖ The MC method can be formulated as an integral form of the Boltzmann equation, e.g., the “emergent particle density equation”

**Density of emerging (from source or collision) particles of given position, energy, direction at a given time**

$$\chi_{E\Omega}(\mathbf{r}, E, \boldsymbol{\Omega}, t) = s_{E\Omega}(\mathbf{r}, E, \boldsymbol{\Omega}, t) + \hat{C}(\mathbf{r}, E' \rightarrow E, \boldsymbol{\Omega}' \rightarrow \boldsymbol{\Omega}) \cdot \hat{T}(\mathbf{r}' \rightarrow \mathbf{r}, E', \boldsymbol{\Omega}') \chi_{E\Omega}(\mathbf{r}', E', \boldsymbol{\Omega}', t)$$

Collision integral operator
Transport integral operator

Density of particles generated by external source

# What is the Monte Carlo method?

"The Monte Carlo technique for the simulation of the transport of electrons and photons through bulk media consists of using knowledge of the probability distributions governing the individual interactions of electrons and photons in materials to simulate the random trajectories of individual particles. One keeps track of physical quantities of interest for a large number of histories to provide the required information about the average quantities" \*

In principle, very straightforward application of radiation physics. Much easier to understand than convolution / superposition

Virtually no approximations of consequence.

\*TG105 quotes Rogers&Bielajew, 1990, in Dosimetry of Ionizing Radiation V3 <http://www.physics.carleton.ca/~drogers/pubs/papers/RB90.pdf>

# Analog versus condensed history MC

## Analog (event-by-event) MC simulation

1. Select the distance to the next interaction  
(random sampling e.g. based on probability  $p(r)dr$  that photon interacts in an interval  $dr$  at a distance  $r$  from initial position:

$$p(r)dr = e^{-\mu r} \mu dr \qquad r = -\frac{\ln(1 - \xi)}{\mu}$$

2. Transport the particle to the interaction site taking into account geometry constraints
3. Select the interaction type (random sampling based on interaction cross section)  
$$1 \text{ if } \xi \leq \frac{\sigma_1}{\sum_i \sigma_i}; \quad 2 \text{ if } \xi \leq \frac{\sigma_1 + \sigma_2}{\sum_i \sigma_i} \dots; \quad n \text{ if } i\xi \leq \frac{\sigma_1 + \sigma_2 + \dots + \sigma_n}{\sum_i \sigma_i}$$

4. Simulate the selected interaction

...and repeat steps 1-4 until the original particle and all secondary particles leave the geometry or are locally absorbed ( $E < \text{threshold}$ )

❖ **Suited for neutral particles**

❖ **Not practicable for charged particles (large number of interactions)**

# Analog versus condensed history MC

## Condensed history MC simulation

- ❖ Many “small-effect” (“soft”) interactions can be grouped into few condensed history “steps”
- ❖ Sample of the cumulative effect from proper distributions of grouped single interactions (multiple scattering, stopping power,...)
- ❖ “Hard” collisions (e.g.,  $\delta$ -ray production) can be explicitly simulated in an analog manner

## Example of $e^-$ track

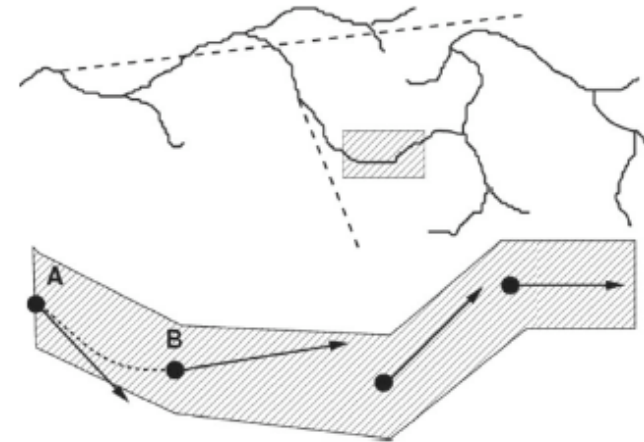


FIG. 1. Illustration of a class II condensed history scheme for electron transport. The upper portion shows a complete electron track including secondary electrons and photons (shown with dashed lines and not including their interactions) with energies above the hard collision thresholds. The lower portion is a magnified view of the shaded box.

*I Chetty et al, Report of the AAPM  
Task Group 105, Med Phys 34, 2007*

***Approach followed in all general purpose MC codes***



# MC methods for radiation transport

***Accuracy and reliability of MC results depends on***

- ❖ Physical processes accounted for
- ❖ Models or data on which pdfs are based
- ❖ Randomness of pseudo-random event generators for sampling
- ❖ Selection of energy cuts and step sizes in particle transport
- ❖ Number of “histories”  $N$  (statistics)

***Computational time and Efficiency***

- ❖ Typical computational times of analog / condensed history transport can be still very expensive (hours to days depending on  $N$ ) for photon and ion therapy, though reduced via parallelization of runs on high performance computer clusters
- ❖ Efficiency  $\varepsilon = (s^2 T)^{-1}$  is rather independent of  $N$ , being  $s^2$  (variance of the quantity of interest)  $\propto 1/N$ ,  $T$  (computing time)  $\propto N$

# Efficiency enhancing methods in MC

## *Efficiency enhancing methods*

- ❖ Variance reduction techniques (aiming to reduce the variance  $s^2$  while not biasing the result)
  - Sampling from artificial distributions, particle weights to account for bias
  - Cannot reproduce physical correlations/fluctuations
  - Enable faster convergence (ONLY for privileged observables)

### • examples

- splitting (brem splitting: UBS, DBS; in-phantom)
- Russian roulette
- interaction forcing
- track repetition
- STOPS (simultaneous transport of particle sets)
- enhanced cross sections (brem: BCSE)

Carleton

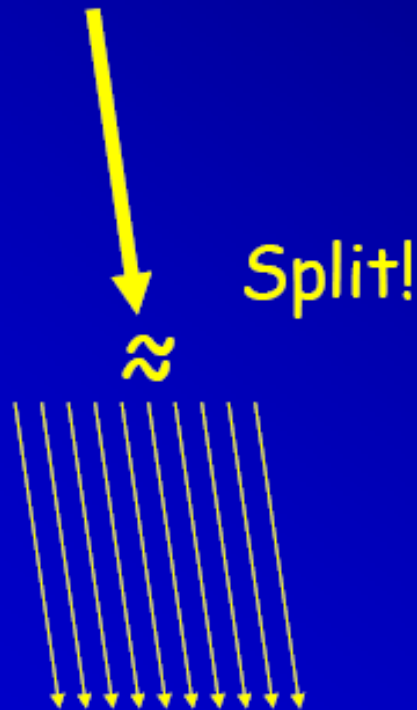
- for a recent review, see **Sheikh-Bagheri et al's** 2006 AAPM summer school chapter

<http://www.physics.carleton.ca/~drogers/pubs/papers/SB06.pdf>

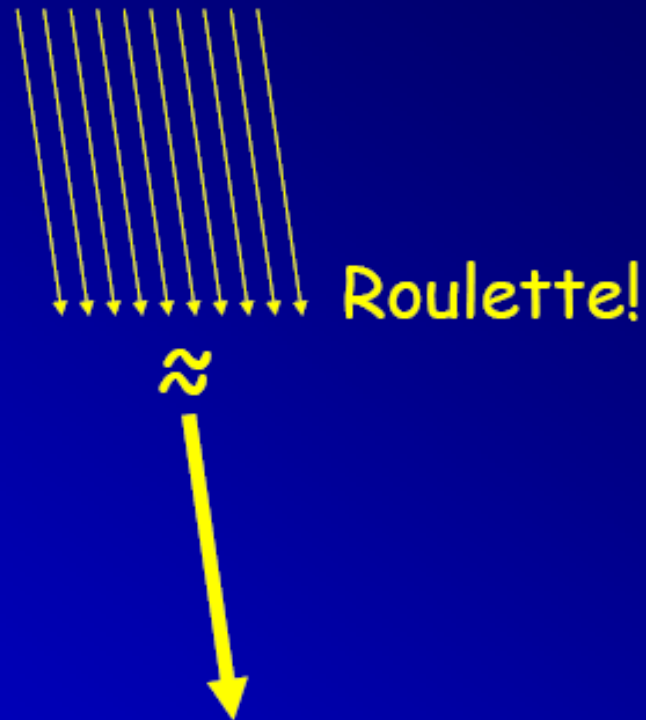
# Efficiency enhancing methods in MC

## Splitting, Roulette & particle weight

$$1 w_i = 10 w_f$$



$$10 w_i = 1 w_f$$





# Efficiency enhancing methods in MC

## *Efficiency enhancing methods*

- ❖ Variance reduction techniques (aiming to reduce the variance  $s^2$ )
  - Sampling from artificial distributions, particle weights to account for bias
  - Cannot reproduce physical correlations/fluctuations
  - Enable faster convergence (ONLY for privileged observables)
- ❖ Setting of energy thresholds and step sizes (reduce time per history)
- ❖ Re-use of particle tracks (particle track-repeating algorithms)

*Rapidly spreading for clinical MC in conventional therapy (photons and electrons) and under investigation for ions*

***To be used with care!***



# The commonly recognized merits of MC

## *MC are powerful computational tools for:*

- ❖ Realistic description of particle interactions, especially in complex geometries and inhomogeneous media where analytical approaches are at their limits of validity
- ❖ Possibility to investigate separate contributions to quantities of interest which may be impossible to be experimentally assessed and/or discriminated

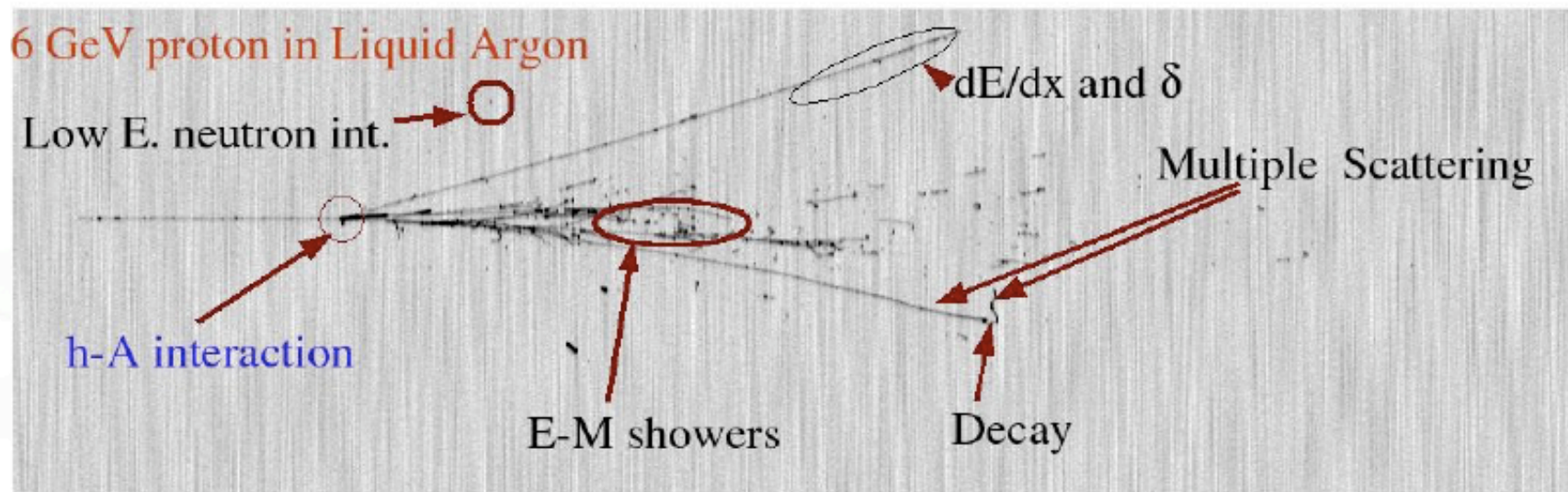


FLUKA

# FLUKA

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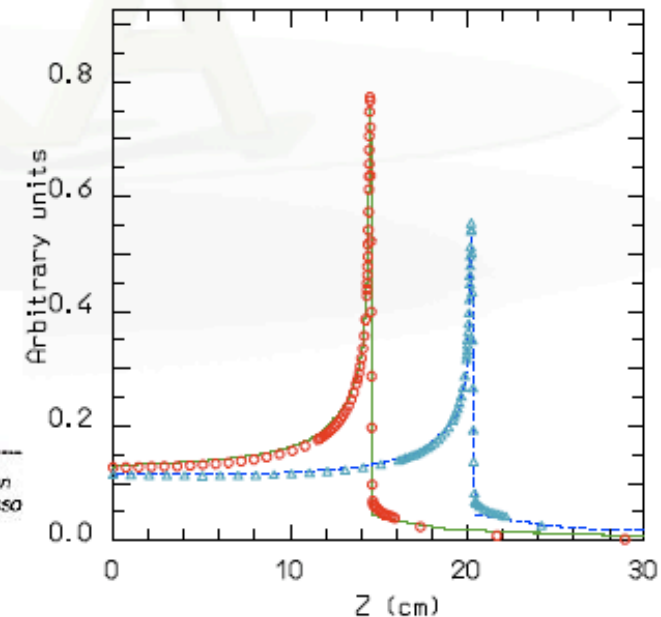
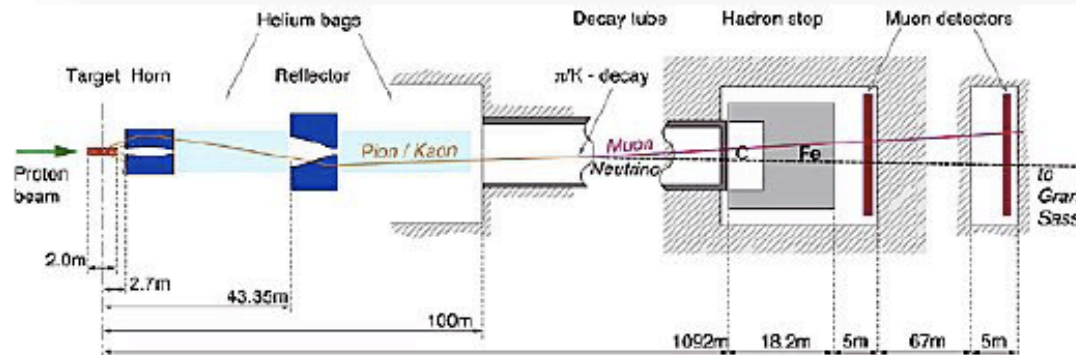
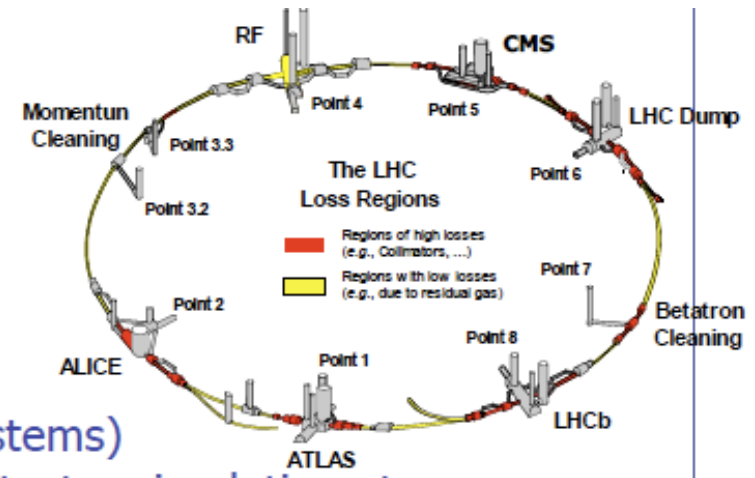


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# FLUKA Applications

- Cosmic ray physics
- Neutrino physics
- Accelerator design (→ n\_ToF, CNGS, LHC systems)
- Particle physics: calorimetry, tracking and detector simulation etc. (→ ALICE, ICARUS, ...)
- ADS systems, waste transmutation, (→ "Energy amplifier", FEAT, TARC, ...)
- Shielding design
- Dosimetry and radioprotection
- Space radiation
- Hadrontherapy
- Neutronics



# The History

## The early days

The beginning:

1962: Johannes Ranft (Leipzig) and Hans Geibel (CERN): Monte Carlo for high-energy proton beams

The name:

1970: study of event-by-event fluctuations in a NaI calorimeter (FLUktuierende KAskade)

Early 70's to ≈1987: J. Ranft and coworkers (Leipzig University) with contributions from Helsinki University of Technology (J. Routti, P. Aarnio) and CERN (G.R. Stevenson, A. Fassò)

Link with EGS4 in 1986, later abandoned

## The modern code: some dates

Since 1989: mostly INFN Milan (A. Ferrari, P.R. Sala): little or no remnants of older versions. Link with the past: J. Ranft and A. Fassò

1990: LAHET / MCNPX: high-energy hadronic FLUKA generator No further update

1993: G-FLUKA (the FLUKA hadronic package in GEANT3). No further update

1998: FLUGG, interface to GEANT4 geometry

2000: grant from NASA to develop heavy ion interactions and transport

2001: the INFN FLUKA Project

2003: official CERN-INFN collaboration to develop, maintain and distribute FLUKA

# The FLUKA Code design - 1

## ■ Sound and updated physics models

- ◆ Based, as far as possible, on original and well-tested **microscopic models**
- ◆ Optimized by comparing with experimental data **at single interaction level**: **"theory driven, benchmarked with data"**
- ◆ Final predictions obtained with **minimal free parameters** fixed for all energies, targets and projectiles
- ◆ Basic **conservation laws fulfilled "a priori"**
  - ***Results in complex cases, as well as properties and scaling laws, arise naturally from the underlying physical models***
  - **Predictivity where no experimental data are directly available**

It is a "condensed history" MC code, with the possibility use of single instead of multiple scattering

# The FLUKA Code design - 2

## ■ Self-consistency

- ◆ Full cross-talk between all components: hadronic, electromagnetic, neutrons, muons, heavy ions
- ◆ Effort to achieve the same level of accuracy:
  - ◆ for each component
  - ◆ for all energies
- Correlations preserved fully within interactions and among shower components
- **FLUKA is NOT a toolkit! Its physical models are fully integrated**

# The Physics Content of FLUKA

- Nucleus-nucleus interactions 100 MeV/n – 10000 TeV/n  
New model (BME, under development): from Coulomb Barrier
- Electromagnetic and  $\mu$  interactions 1 keV – 10000 TeV
- Hadron-hadron and hadron-nucleus interactions 0–10000 TeV
- Neutrino interactions  (new DIS and RES generator!)
- Charged particle transport including all relevant processes
- Transport in magnetic field
- Neutron multigroup transport and interactions 0 – 20 MeV  
 new library with 260 groups
- Analog calculations, or with variance reduction

## Code complexity

- Inelastic h-N: **~72000 lines**
- Cross sections (h-N and h-A), and elastic (h-N and h-A): **~32000 lines**
- (G)INC and preequilibrium (PEANUT): **~114000 lines**
- Evap./Fragm./Fission/Deexc.: **~27000 lines**
- $\nu$ -N interactions: **~35000 lines**
- A-A interactions:
  - ✓ FLUKA native (including BME): **~8000 lines**
  - ✓ DPMJET-3: **~130000 lines**
  - ✓ (modified) rQMD-2.4: **~42000 lines**
- ❑ **FLUKA** in total (including transport, EM, geometry, scoring): **~68000 lines**
- ❑ ... + **~20000 lines** of ancillary off-line codes used for data pre-generation
- ❑ ... and **~30000 lines** of post-processing codes



# EM INTERACTION

# Topics



- General settings
- Interactions of leptons/photons
  - Photon interactions
    - ◆ Photoelectric
    - ◆ Compton
    - ◆ Rayleigh
    - ◆ Pair production
    - ◆ Photonuclear
    - ◆ Photomuon production
  - Electron/positron interactions
    - ◆ Bremsstrahlung
    - ◆ Scattering on electrons
  - Muon interactions
    - ◆ Bremsstrahlung
    - ◆ Pair production
    - ◆ Nuclear interactions

- Ionization energy losses
  - Continuous
  - Delta-ray production
- Transport
  - Multiple scattering
  - Single scattering

*These are common to all charged particles, although traditionally associated with EM*

- ⑩ Transport in Magnetic field



## Ionization energy losses

- Charged hadrons
- Muons
- Electrons/positrons

*All share the same approach*

- Heavy Ions

They need some extra features

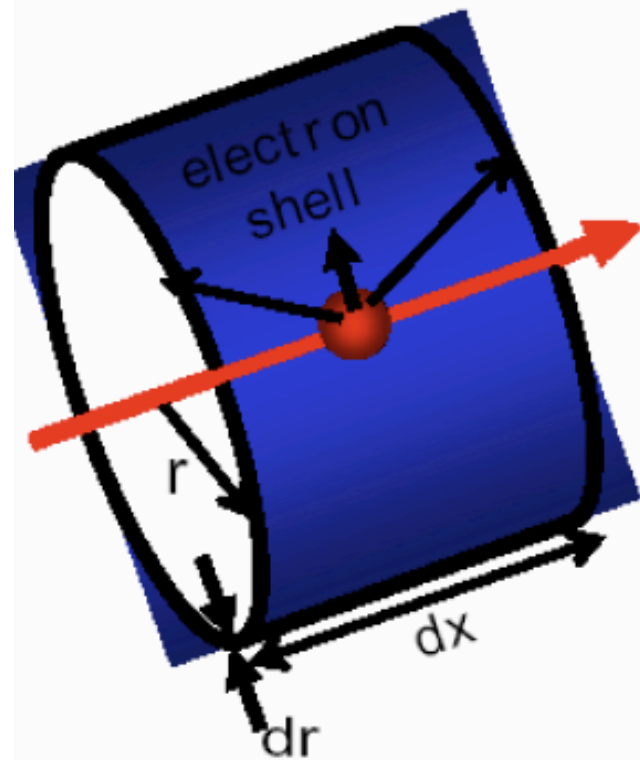
# Phenomenological Model Of Energy Loss in Matter

2.

Integrate over radial coordinate:

$$\frac{dE(x)}{dx} = \int_{r_{min}}^{r_{max}} dr \frac{dE(r, x)}{dr dx}$$

$$-\frac{dE(x)}{dx} \sim \left[ \frac{4\pi e^4 Z_p^2}{m_e v^2} N_e \right] \cdot \ln \left( \frac{r_{max}}{r_{min}} \right)$$



$r_{min}$  corresponds to maximum kinetic energy  $T_{max}$  gained by e<sup>-</sup>  
It corresponds to head-on-collision:

$$v = \frac{2M}{m + M} v_0 \xrightarrow{M \gg m} v = 2v_0 \longrightarrow T_{max} = \frac{1}{2} m (2v)^2 = 2mv^2$$

$$T_{max} = \frac{(\Delta p_{max})}{2m_e} = \frac{2Z_p^2 e^4}{m_e v^2 r_{min}^2} = 2m_e v^2$$

$$r_{min}^2 = \frac{Z_p^2 e^4}{m_e v^4}$$

$r_{max}$  corresponds to minimum kinetic energy  $T_{min}$  gained by e<sup>-</sup>

$$T_{min} = IE = \text{ionization energy} \begin{cases} (12 \cdot Z_T + 7) \text{ eV} & \text{for } Z_T < 13 \\ (9.76 \cdot Z_T + 58.8 \cdot Z_T^{-0.19}) \text{ eV} & \text{for } Z_T \geq 13 \end{cases} \sim 10 Z \text{ eV}$$

$$T_{min} = IE = \frac{2Z_p^2 e^4}{m_e v^2 r_{max}^2}$$

$$r_{max}^2 = \frac{2Z_p^2 e^4}{(IE) m_e v^2}$$

Estimate of Radial Limits:

$$-\frac{dE(x)}{dx} \sim \left[ \frac{4\pi e^4 Z_p^2}{m_e v^2} N_e \right] \cdot \ln \left( \frac{r_{max}}{r_{min}} \right) \approx \frac{4\pi Z_p^2 e^4}{m_e v^2} N_e \frac{1}{2} \ln \left[ \frac{2m_e v^2}{IE} \right]$$

**Insert:**  $\rho$  = atomic density,  $Z_T$  = atomic number of target

$$N_e = Z_T \cdot \rho$$

$$-\frac{1}{\rho} \frac{dE}{dx} \approx \frac{4\pi Z_p^2 e^4}{m_e v^2} Z_T \frac{1}{2} \ln \left[ \frac{2m_e v^2}{IE} \right]$$

*Phenomenological model*

## Bethe-Bloch Quantum Mechanical Equation (for heavy particles $M \gg m_e$ )

*Average energy loss*

$$-\frac{1}{\rho} \frac{dE}{dx} \approx 0.1535 \frac{Z_p^2 Z_T}{\beta^2 A_T} \left[ \ln \left( \frac{2m_e c^2}{IE(1-\beta^2)} \right)^2 - 2\beta^2 \right] \frac{\text{MeV}}{\text{g/cm}^2}$$

$\rho$  = atomic density

$Z_T$  = atomic number of target

$A_T$  = mass number of target

$$IE = h\nu_e \approx \begin{cases} (12 \cdot Z_T + 7) \text{ eV} & \text{for } Z_T < 13 \\ (9.76 \cdot Z_T + 58.8 \cdot Z_T^{0.19}) \text{ eV} & \text{for } Z_T \geq 13 \end{cases}$$

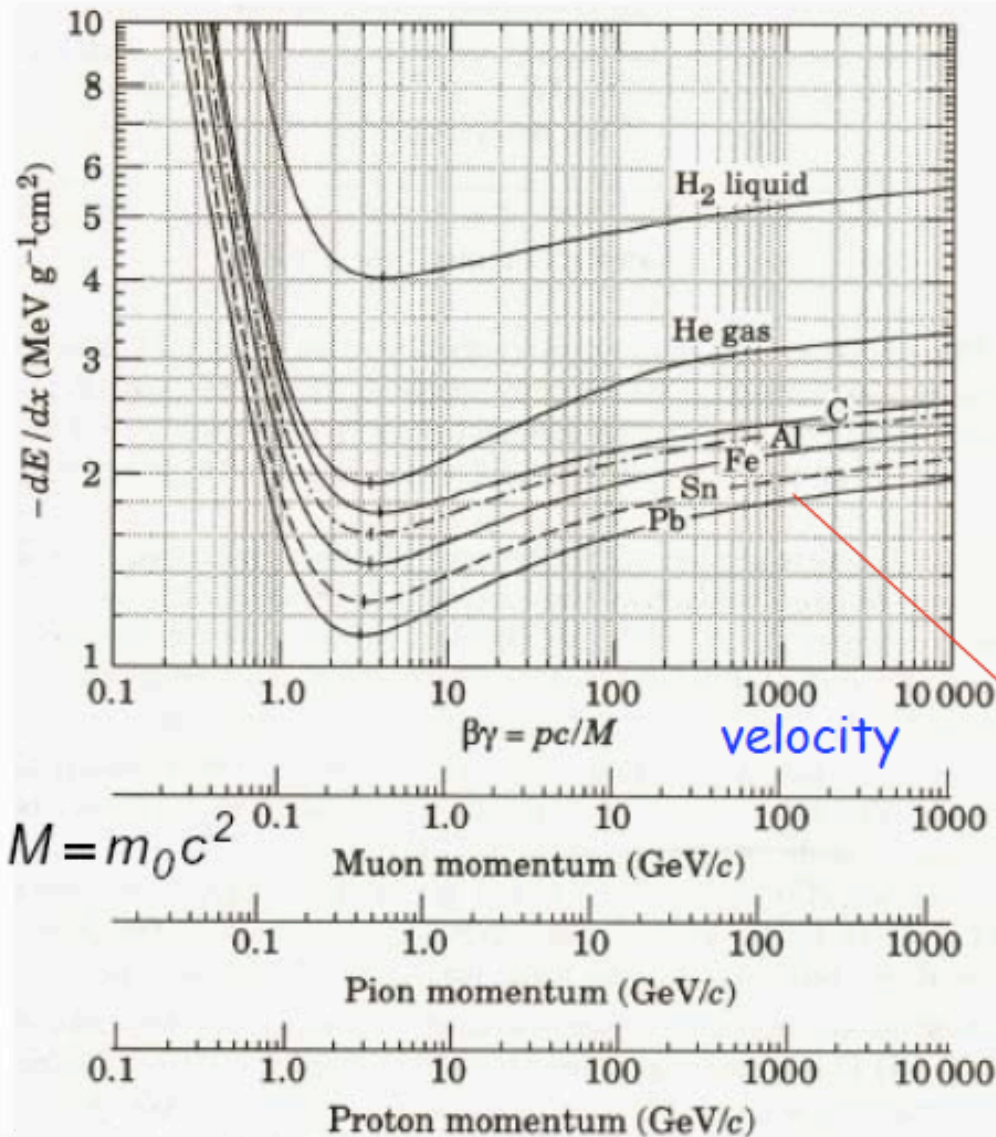
$$-\frac{dE}{dx} \approx \rho Z_T \rightarrow \text{Large in dense material}$$

$$-\frac{dE}{dx} \approx Z_p^2 \rightarrow \text{Large for heavy ions}$$

$$\approx 1/v^2 \rightarrow \text{Large for slow particles}$$

# Stopping Power of Relativistic Particles

Review of Particle Properties, Phys. Rev. D50, 1173 (1994)



$$E^2 = (pc)^2 + (m_0 c^2)^2$$

$m_0 =$  particle rest mass

$v =$  particle velocity

$$c = 2.9979 \cdot 10^8 \text{ m s}^{-1}$$

$$\beta = v/c$$

$$\gamma = \left( \sqrt{1 - \beta^2} \right)^{-1}$$

$$pc = (\gamma m_0) v c = \gamma \beta m_0 c^2$$

Relativistic rise:

part of the energy is subtracted by light (Cerenkov radiation)

Note: here  $p dE/dx \rightarrow dE/dx$

# Delta Ray Contribution, an example I: <sup>12</sup>C ion therapy

For an incident particle with mass  $M$  and momentum  $M\beta\gamma c$ , the maximum kinetic energy  $T_{MAX}$  which can be imparted to a free electron with mass  $m_e$  in a single collision, is given by the following expression [Ref. 3.2]:

$$T_{MAX} = \frac{2m_e c^2 \beta^2 \gamma^2}{1 + 2m_e \gamma / M + (m_e / M)^2} \quad (3.1).$$

When  $2m_e \gamma / M \ll 1$ , such in the case of Carbon ions, the above relation can be further simplified and the following “low energy” approximation is used:

$$T_{MAX} = 2m_e c^2 \beta^2 \gamma^2 \quad (3.2).$$

Using this relation the  $\delta$ -rays maximum kinetic energy has then been determined for an incident <sup>12</sup>C ion beam with kinetic energy varying between 80 MeV/n and 430 MeV/n corresponding to a range in tissue between 20 mm and 330 mm respectively: resulting values are included in the interval ranging from 180 keV to 1.16 MeV.

In order to estimate the number of  $\delta$ -ray electrons ejected by an incident carbon ion per unit length of ion path the following formula [Ref. 3.2], representing the distribution of secondary electrons with kinetic energies  $T \gg I$  ( $I$  = mean excitation energy = 75 eV in water), can be used:

$$\frac{d^2N}{dTdx} = \frac{1}{2} Kz^2 \frac{Z}{A} \frac{1}{\beta^2} \frac{F(T)}{T^2} \quad (3.3).$$

Here  $\beta$  and  $z$  are the velocity and the charge of the primary particle while the spin dependent factor  $F(T)$  is given by:

$$F(T) = 1 - \beta^2 T/T_{MAX}$$

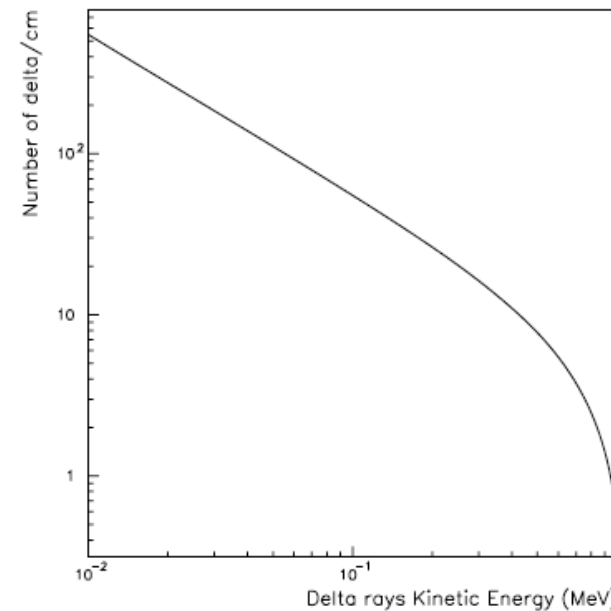
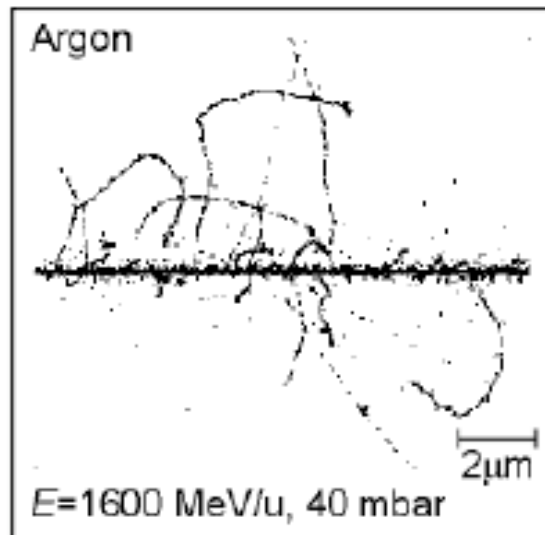


Fig. 3.1: Secondary electron spectrum from incident  $^{12}\text{C}$  ion beam with initial kinetic energy  $E = 430 \text{ MeV/n}$  in water.



## Continuous energy losses

Below the  $\delta$ -ray threshold, energy losses are treated as "continuous", with some special features:

- Fluctuations of energy loss are simulated with a FLUKA-specific algorithm
- The energy dependence of cross sections and  $dE/dx$  is taken into account exactly (see later)
- Latest recommended values of ionization potential and density effect parameters implemented for elements (Sternheimer, Berger & Seltzer), but can be overridden by the user with (set yourself for compounds!)

# Ionization fluctuations -I

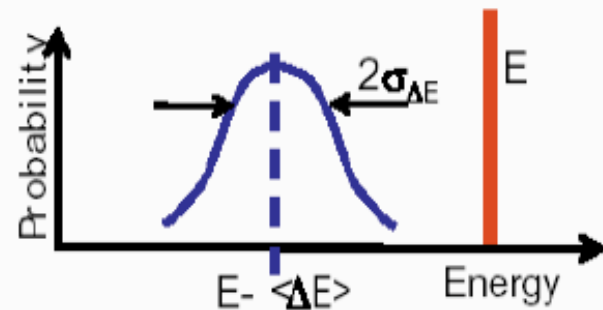
The Landau distribution is limited in several respects:

- Max. energy of  $\delta$  rays assumed to be  $\infty \implies$  cannot be applied for long steps or low velocities
- cross section for close collisions assumed equal for all particles
- fluctuations connected with distant collisions neglected  $\implies$  cannot be applied for short steps
- incompatible with explicit  $\delta$ -ray production

The Vavilov distribution overcomes some of the Landau limitations, but is difficult to compute if step length or energy are not known *a priori*.

## Energy Loss Distributions

Absorber of thickness  $x$ ; ( $\rho, Z_T, A_T$ ), many statistical scattering events  
 → Central Limit Theorem: Gaussian distribution in energy loss  $\Delta E$



$$\Gamma_{FWHM} = 2.35 \cdot \sigma$$

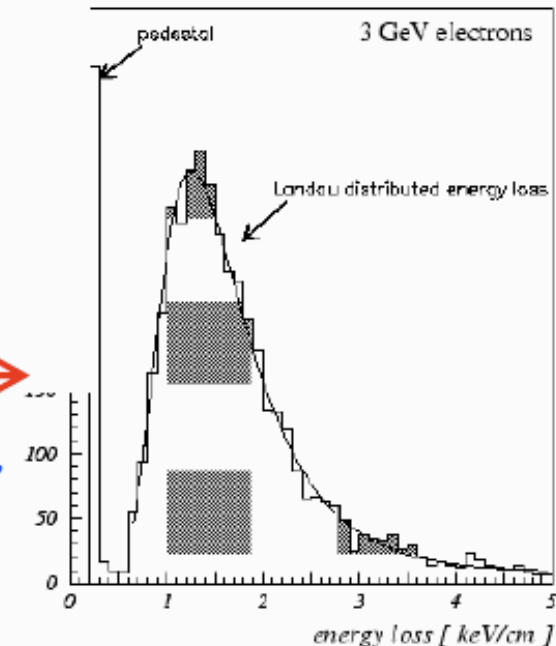
*The distribution is Gaussian only if  $\Delta x$  is large enough*

$$P(\Delta E) \propto \exp \left\{ -\frac{(\Delta E - \langle \Delta E \rangle)^2}{2\sigma_{\Delta E}^2} \right\}$$

$$\sigma_{\Delta E} = 4\pi N_A r_e^2 m_e^2 c^4 \rho \frac{Z_T}{A_T} x = 0.1569 \rho \frac{Z_T}{A_T} x \text{ MeV}^2$$

Thin absorber: Asymmetric tail towards higher  $\Delta E$

*Landau has shown that the asymmetric tail is due to great energy losses in close collisions*

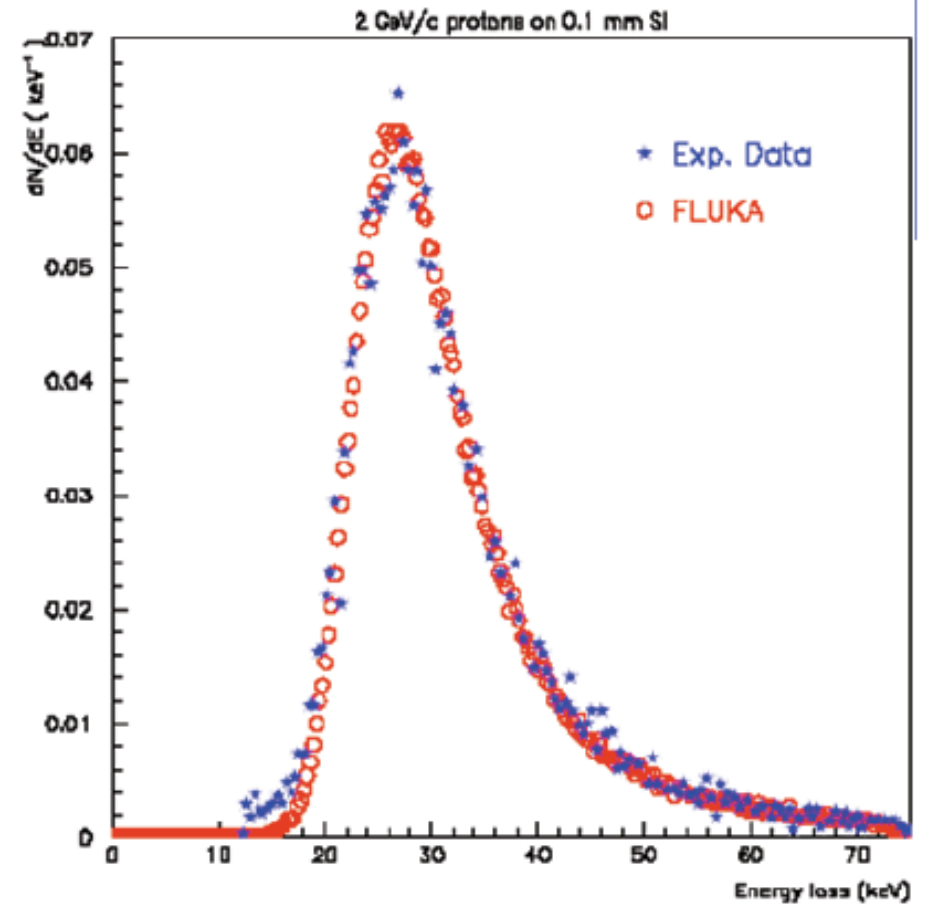
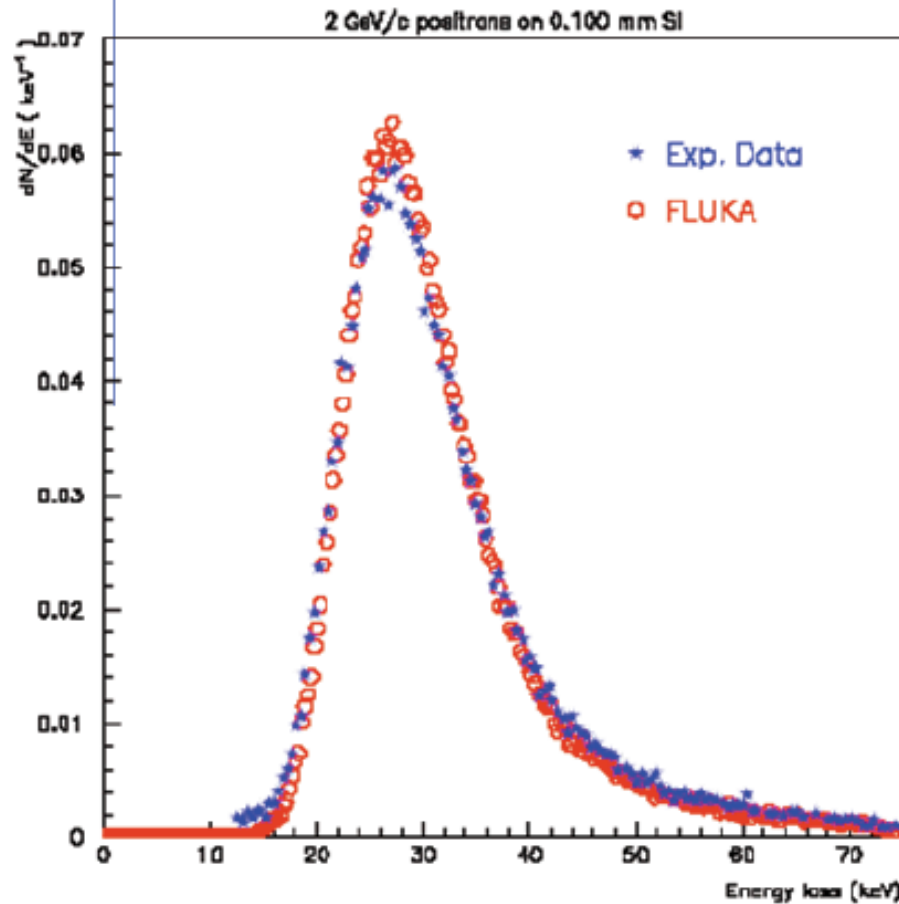


## Ionization fluctuations -II

The FLUKA approach:

- based on general statistical properties of the cumulants of a distribution (in this case a Poisson distribution convoluted with  $d\sigma/dE$ )
- integrals can be calculated analytically and exactly a priori  
 $\implies$  minimal CPU time
- applicable to any kind of charged particle, taking into account the proper (spin-dependent) cross section for  $\delta$  ray production
- the first 6 moments of the energy loss distribution are reproduced  
( $k_n = \langle (x - \langle x \rangle)^n \rangle$ )

# Ionization fluctuations -III



Experimental<sup>1</sup> and calculated energy loss distributions for 2 GeV/c positrons (left) and protons (right) traversing 100 $\mu\text{m}$  of Si  
J.Bak et al. NPB288, 681 (1987)



## Energy dependent quantities I

- Most charged particle transport programs sample the next collision point evaluating the cross section at the beginning of the step, neglecting its energy dependence and the particle energy loss
- The cross section for  $\delta$  ray production at low energies is roughly inversely proportional to the particle energy  
 $\implies$  a typical 20% fractional energy loss per step would correspond to a similar variation in the cross section
- Some codes use a rejection technique based on the ratio between the cross section values at the two step endpoints, but this approach is valid only for a monotonically decreasing cross section

## Energy dependent quantities II

FLUKA takes into account exactly the continuous energy dependence of

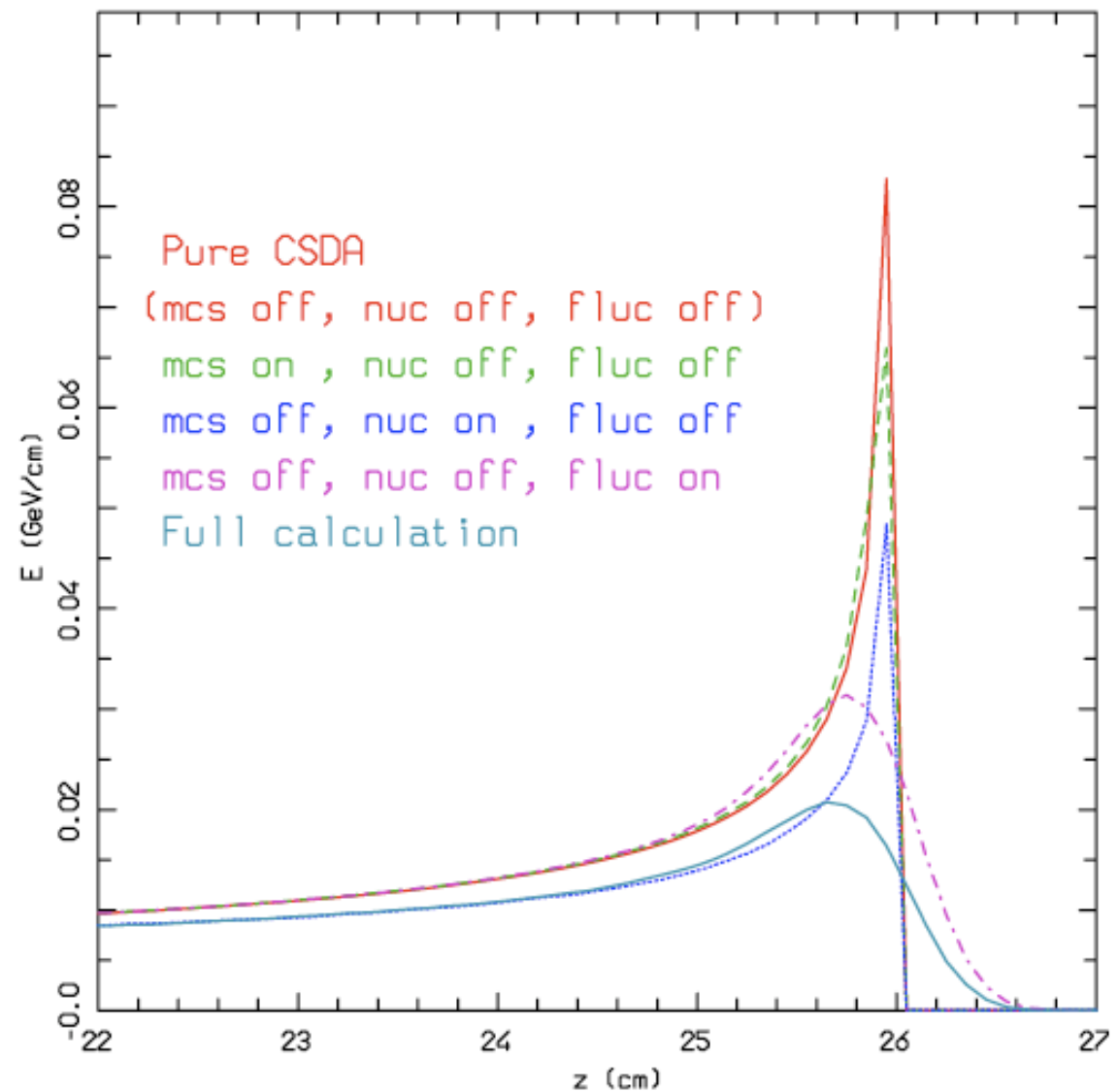
- discrete event cross-section
- stopping power

basing the rejection technique on the ratio between the cross section value at the second endpoint and its maximum value between the two endpoint energies.

# Playing with a proton beam

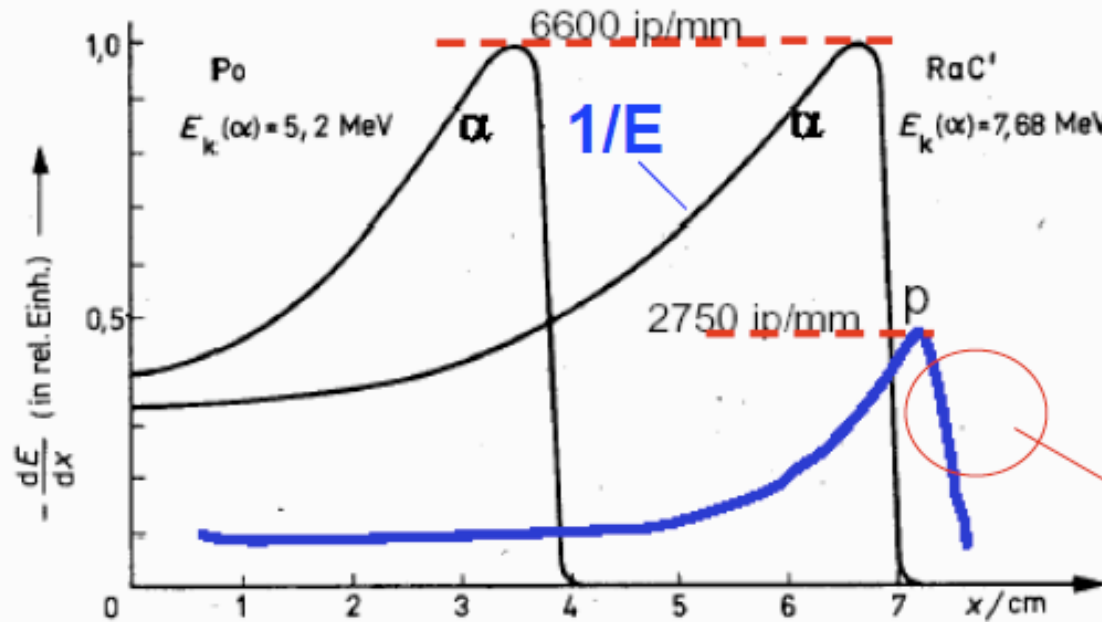
Dose vs depth  
energy deposition  
in water for a 200  
MeV p beam with  
various approximations  
for the physical  
processes taken into  
account

200 MeV p on water (pencil beam)



# Range and Specific Ionization

E-loss in Air: 1atm, 15°C



Stopping power  $dE/dx$  (specific energy loss) depends on energy  $E$  and therefore on  $x$

➔ **Bragg Curve**

Highest E loss close to end of path ➔ *Charge is reduced due to electrons pick up*  
Bragg maximum

$$\frac{dE}{dx} \triangleq \frac{\#(e^- - \text{ion pairs})}{\text{unit length}}$$

$\alpha$  particles:

$$\frac{dE}{dx} \leq \frac{7 \cdot 10^3 \text{ pairs}}{\text{mm}}$$

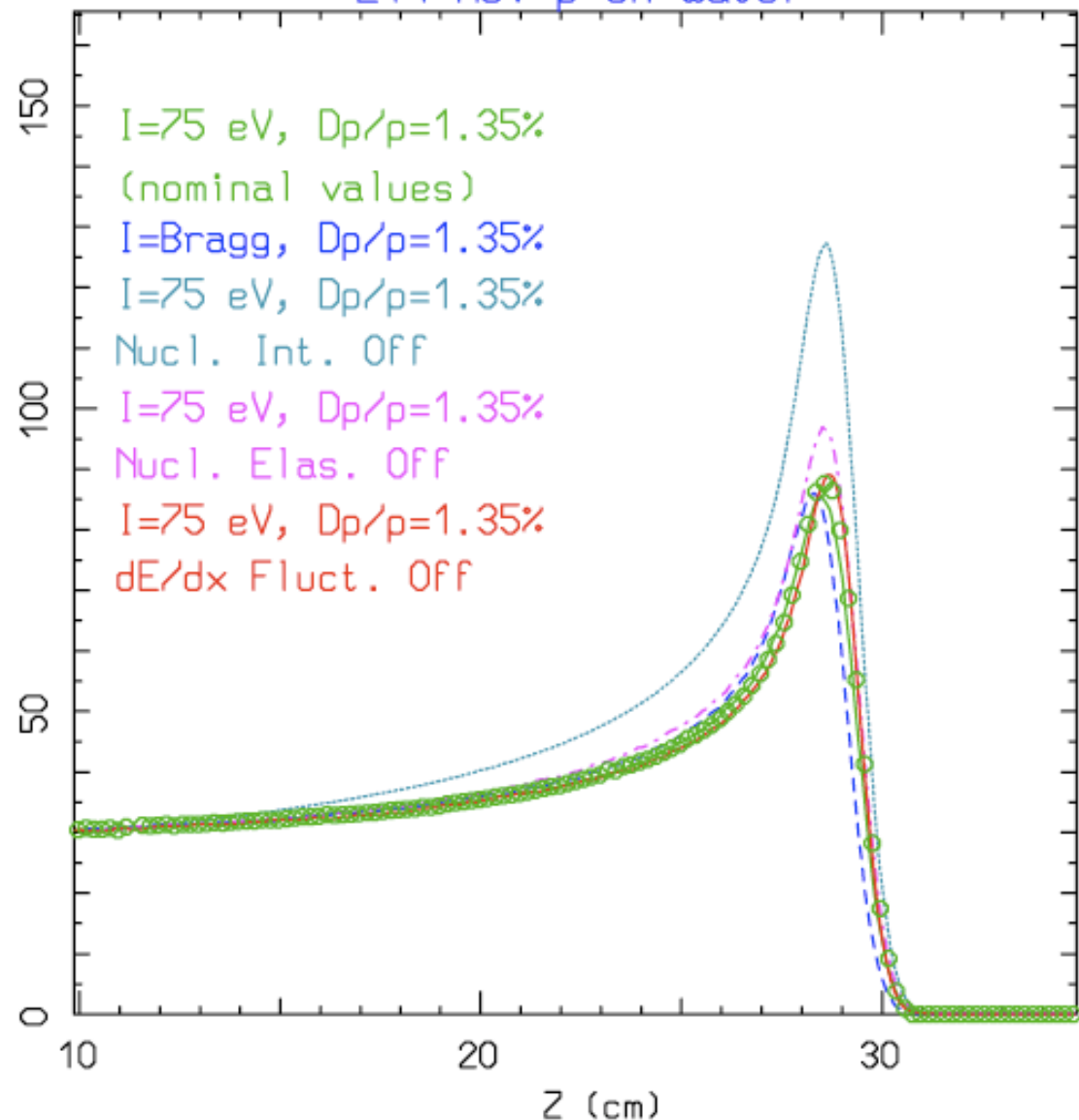
Main E-loss mechanism: ionization, production of  $\delta$  electrons, electron-ion pairs

# Playing with a proton beam II part

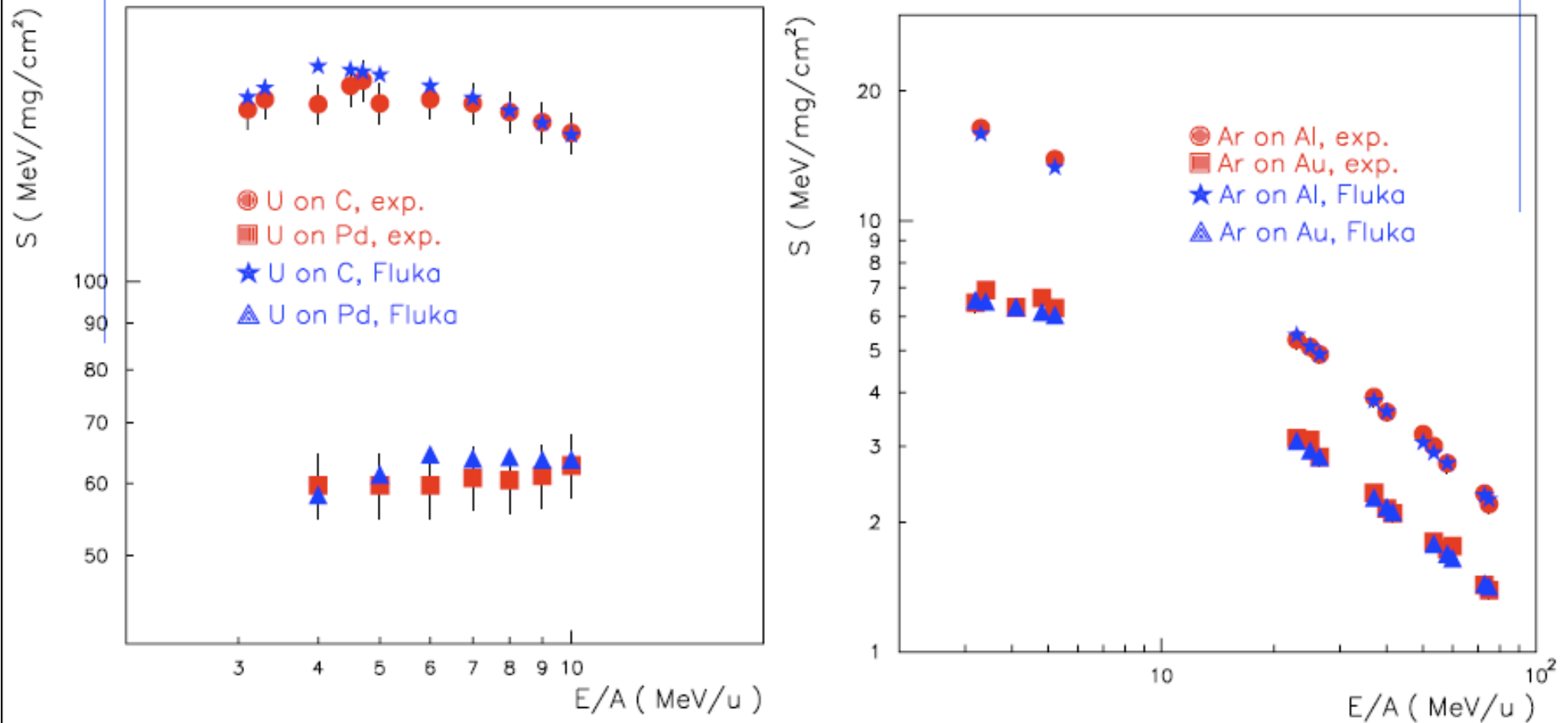
214 MeV p on Water

Dose vs depth  
energy deposition  
in water for a 214  
MeV real p beam  
under various  
conditions.

Exp. Data from PSI



# Heavy ions dE/dx

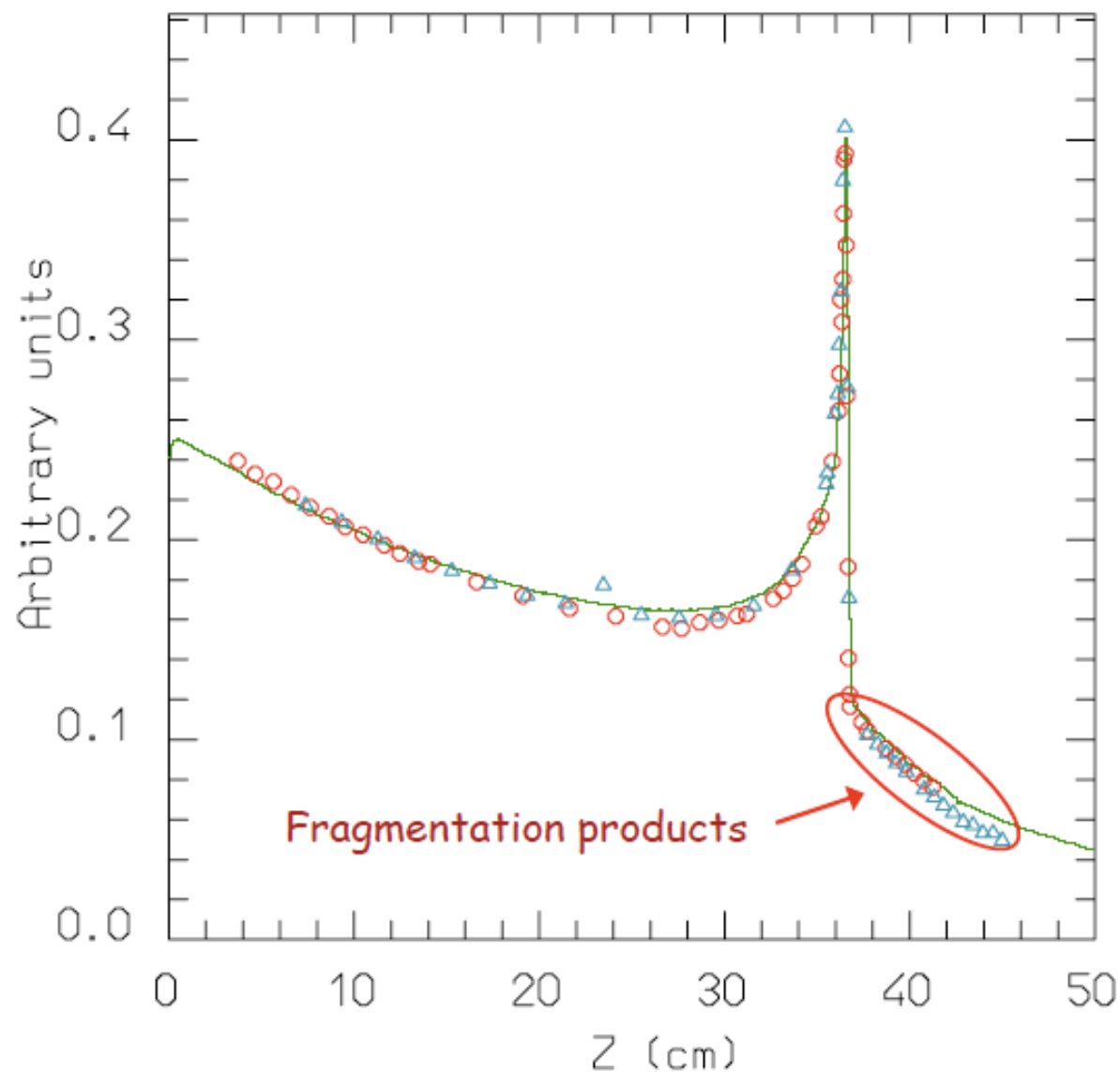


Comparison of experimental (R.Bimbot, NIMB69 (1992) 1) (red) and FLUKA (blue) stopping powers of Argon and Uranium ions in different materials and at different energies.

## Bragg peaks vs exp. data: $^{20}\text{Ne}$ @ 670 MeV/n

Dose vs depth distribution for 670 MeV/n  $^{20}\text{Ne}$  ions on a water phantom. The green line is the FLUKA prediction. The symbols are exp. data from LBL and GSI.

Exp. Data  
Jpn.J.Med.Phys. 18,  
1,1998



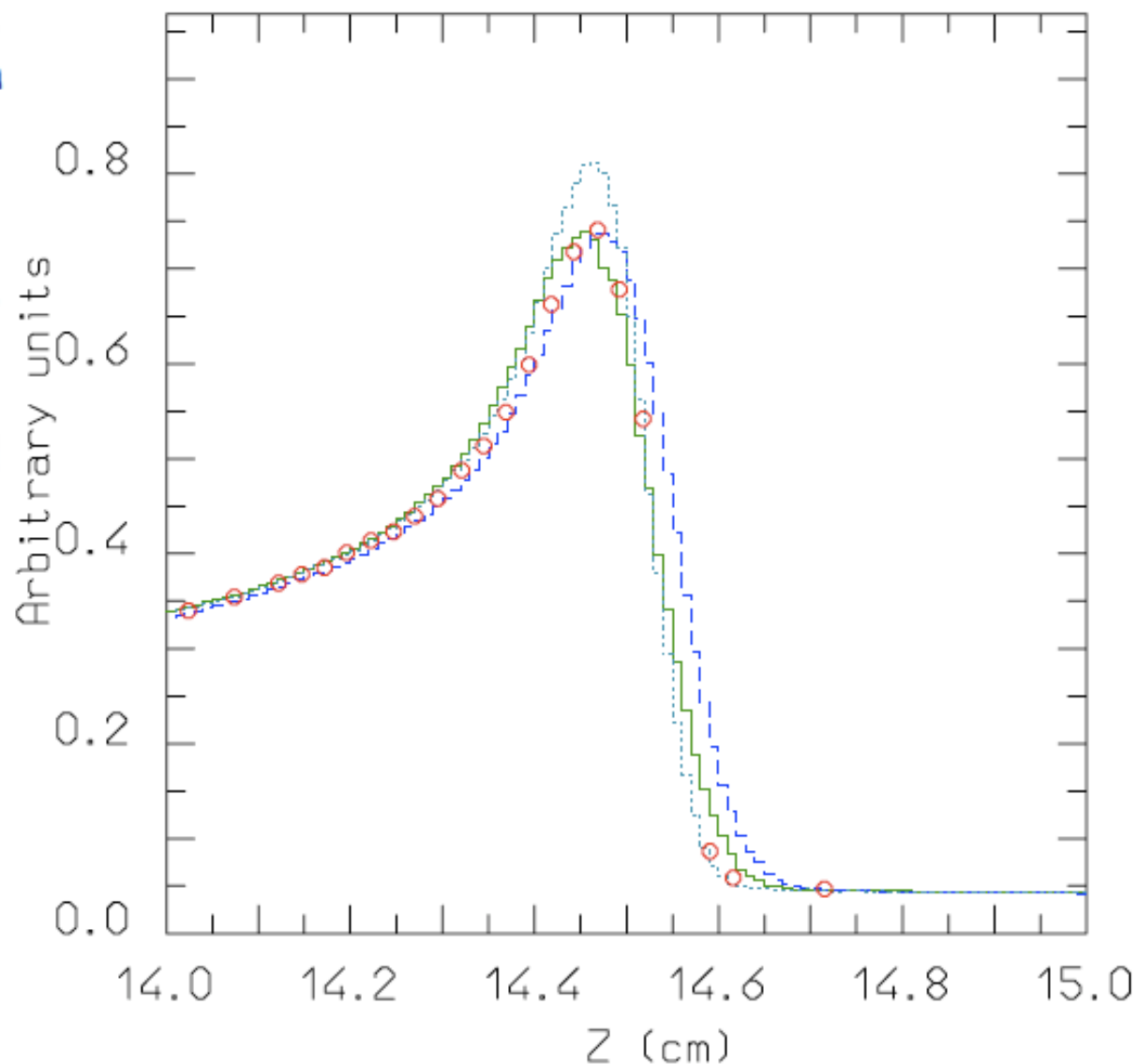
## Bragg peaks vs exp. data: $^{12}\text{C}$ @ 270 MeV/n

Close-up of the dose vs depth distribution for 270 MeV/n  $^{12}\text{C}$  ions on a water phantom.

The green line is the FLUKA prediction with the nominal 0.15% energy spread

The dotted light blue line is the prediction for no spread, and the dashed blue one the prediction for  $I$  increased by 1 eV

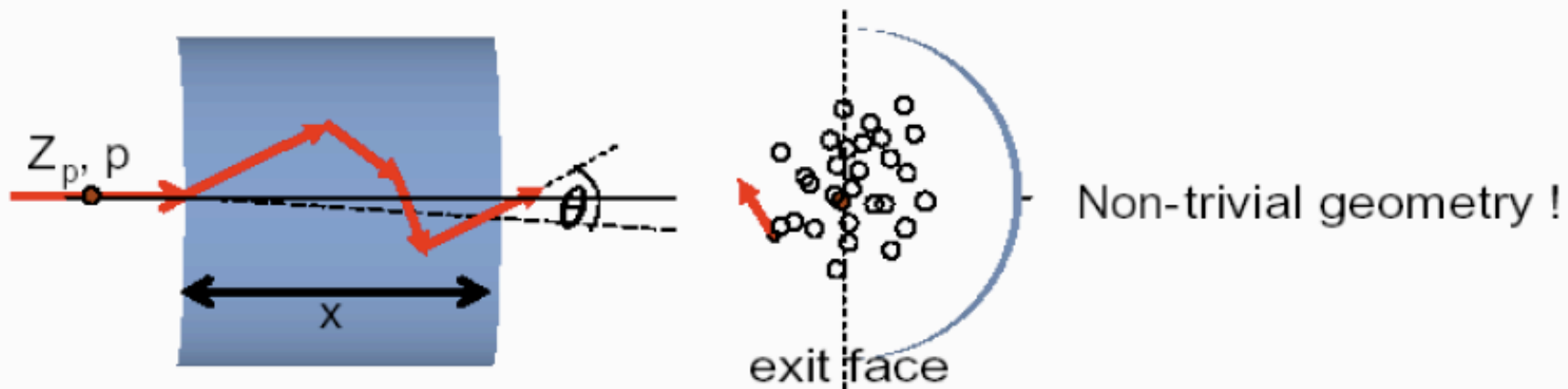
Exp. Data  
Jpn.J.Med.Phys. 18,  
1,1998



## Angular Straggling

Theory by Moliere, see W.T. Scott, Rev. Mod. Phys. 35, 231 (1963)

HI : M. Wong et al., Med. Phys. 17, 163 (1990)



$$\frac{d\sigma_{MS}(\theta)}{d\Omega} = \frac{1}{2\pi\theta_0^2} \exp\left\{-\frac{\theta^2}{2\theta_0^2}\right\}$$

cross section

Assume multiple  
Coulomb scattering

$$\theta_0 \approx \frac{13.6 \text{ MeV}}{\beta pc} Z_p \sqrt{\frac{x}{L}} \left[ 1 + 0.038 \ln\left(\frac{x}{L}\right) \right]$$

Gaussian angular  
distribution

$$L \approx \frac{716.4 A_T}{Z_T (Z_T + 1) \ln(287/\sqrt{Z_T})} \frac{g}{\text{cm}^2} \quad \text{radiation length}$$

- mean distance over which a high-energy  $e^-$  reduces to  $1/e$  of its energy by bremsstrahlung
- $7/9$  of the mean free path for pair production by a high-energy photon
- appropriate scale length for high-energy electromagnetic cascades

# Charged particle transport

Besides energy losses, charged particles undergo scattering by atomic nuclei. The **Molière** multiple scattering (**MCS**) theory is commonly used to describe the cumulative effect of all scatterings along a charged particle step. However

- **Final** deflection wrt initial direction
- **Lateral** displacement during the step
- **Shortening** of the straight step with respect to the total trajectory due to "wiggleness" of the path (often referred to as **PLC**, path length correction)
- **Truncation** of the step on boundaries
- Interplay with **magnetic field**

**MUST** all be accounted for accurately, to avoid **artifacts** like unphysical distributions on boundary and **step length dependence of the results**

# The FLUKA MCS

- Accurate **PLC** (not the average value but sampled from a distribution), giving a **complete independence from step size**
- Correct **lateral displacement** even near a boundary
- **Correlations:**
  - PLC  $\Leftrightarrow$  lateral deflection
  - lateral displacement  $\Leftrightarrow$  longitudinal displacement
  - scattering angle  $\Leftrightarrow$  longitudinal displacement
- Variation with energy of the Moliere **screening correction**
- Optionally, **spin-relativistic corrections** (1st or 2nd Born approximation) and effect of nucleus finite size (**form factors**)
- **Special geometry tracking near boundaries**, with automatic control of the step size
- On user request, **single scattering** automatically replaces multiple scattering for steps close to a boundary or too short to satisfy Moliere theory. A full Single Scattering option is also available.
- Moliere theory used strictly within its **limits of validity**
- combined effect of MCS and **magnetic fields**



## The FLUKA MCS - II

- As a result, FLUKA can correctly simulate **electron backscattering** even at very low energies and in most cases without switching off the condensed history transport (a real challenge for an algorithm based on Moliere theory!)
- The sophisticated treatment of boundaries allows also to deal successfully with gases, very thin regions and interfaces
- The same algorithm is used for charged hadrons and muons



## Single Scattering

- In very thin layers, wires, or gases, Molière theory does not apply.
- In FLUKA, it is possible to replace the standard multiple scattering algorithm by **single scattering** in defined materials (option MULSOPT).
- Cross section as given by Molière (for consistency)
- Integrated analytically without approximations
- Nuclear and spin-relativistic corrections are applied in a straightforward way by a rejection technique

## Electron Backscattering

Energy (keV)	Material	Experim. (Drescher et al 1970)	FLUKA Single scattering	FLUKA Multiple scattering	CPU time single/mult ratio
9.3	Be	0.050	0.044	0.40	2.73
	Cu	0.313	0.328	0.292	1.12
	Au	0.478	0.517		1.00
102.2	Cu	0.291	0.307	0.288	3.00
	Au	0.513	0.502	0.469	1.59

Fraction of normally incident electrons backscattered out of a surface. All statistical errors are less than 1%.



# NUCLEAR INTERACTIONS

# The FLUKA hadronic Models

Hadron-nucleus: PEANUT

Elastic, exchange  
Phase shifts  
data, eikonal

$P < 3-5 \text{ GeV}/c$   
Resonance prod  
and decay

hadron

hadron

low E  
 $\pi, K$   
Special

High Energy  
DPM  
hadronization

Sophisticated  
G-Intranuclear Cascade

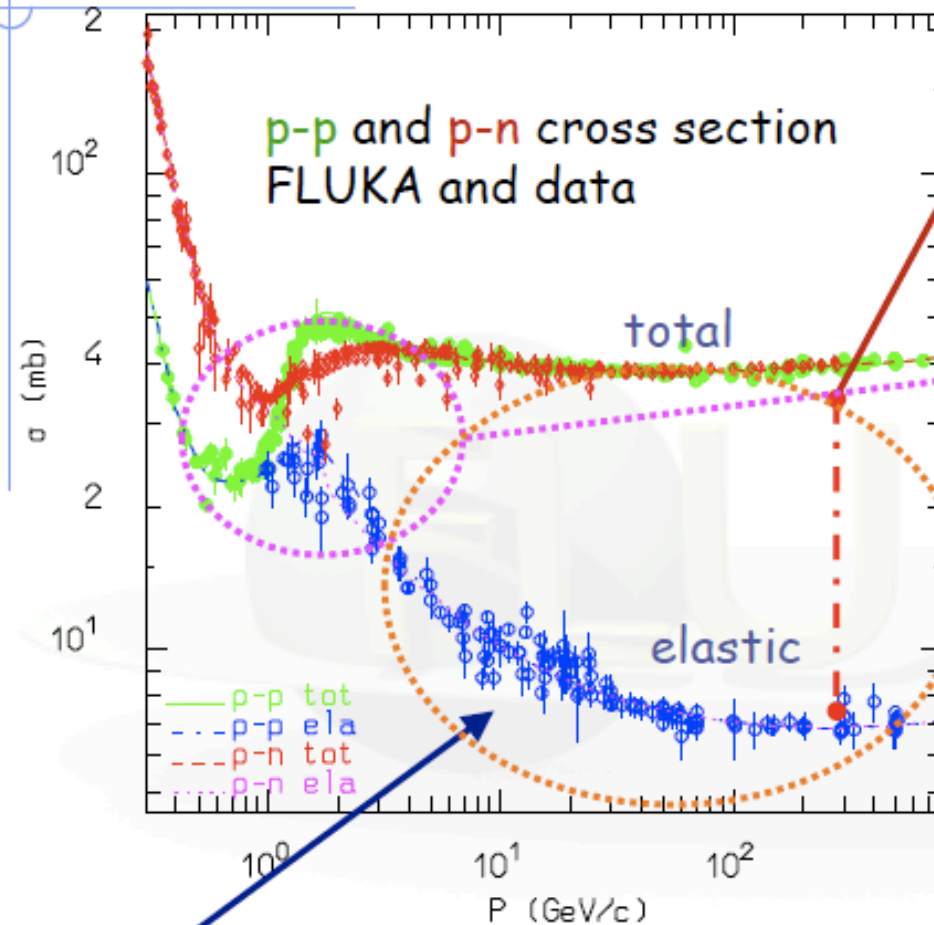
Gradual onset of  
Glauber-Gribov multiple  
interactions

Preequilibrium

Coalescence

Evaporation/Fission/Fermi break-up  
 $\gamma$  deexcitation

# Hadron-nucleon interaction models



Particle production interactions:  
two kinds of models

Those based on "resonance"  
production and decays, cover the  
energy range up to 3-5 GeV

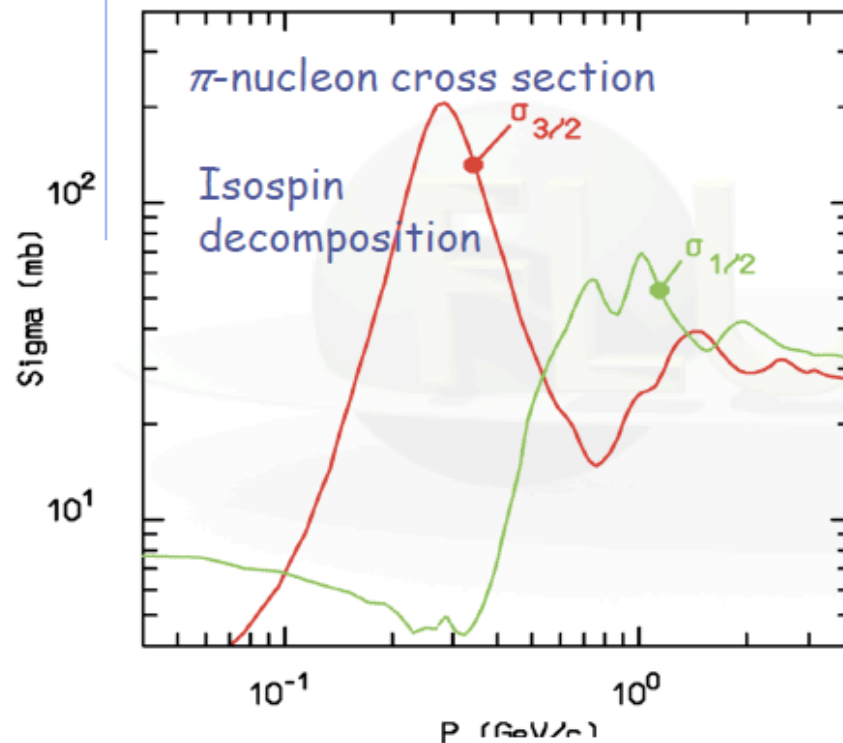
Those based on quark/parton  
string models, which provide  
reliable results up to several tens  
of TeV

- Elastic, charge exchange and strangeness exchange reactions:
- Available phase-shift analysis and/or fits of experimental differential data
  - At high energies, standard eikonal approximations are used

## Nonelastic hN interactions at intermediate energies

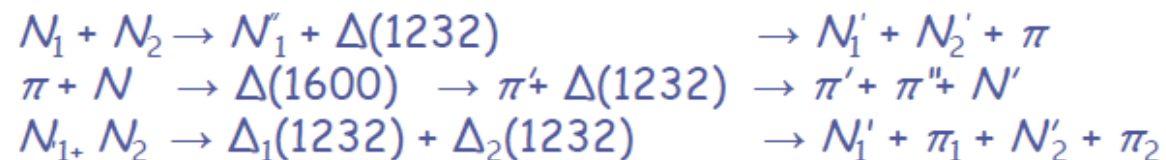
- $N_1 + N_2 \rightarrow N'_1 + N'_2 + \pi$  threshold at 290 MeV, important above 700 MeV,
- $\pi + N \rightarrow \pi' + \pi'' + N'$  opens at 170 MeV.

Anti-nucleon-nucleon open at rest!



Dominance of the  $\Delta$  resonance and of the  $N^*$  resonances  
 → isobar model  
 → all reactions proceed through an intermediate state containing at least one resonance.

Resonance energies, widths, cross sections, branching ratios from data and conservation laws, whenever possible. Inferred from inclusive cross sections when needed



# Nuclear interactions in PEANUT:

Target nucleus description (density, Fermi motion, etc)

Glauber-Gribov cascade with formation zone

Generalized IntraNuclear cascade

Preequilibrium stage with current exciton configuration and excitation energy  
(all non-nucleons emitted/decayed + all nucleons below 30-100 MeV)

Evaporation/Fragmentation/Fission model

$\gamma$  deexcitation

$t$  (s)

$10^{-23}$

$10^{-22}$

$10^{-20}$

$10^{-16}$

## Preequilibrium emission

For  $E > \pi$  production threshold  $\rightarrow$  only (G)INC models  
At lower energies a variety of preequilibrium models

### Two leading approaches

The quantum-mechanical multistep model:  
Very good theoretical background  
Complex, difficulties for multiple emissions

The semiclassical exciton model  
Statistical assumptions  
Simple and fast  
Suitable for MC

#### Statistical assumption:

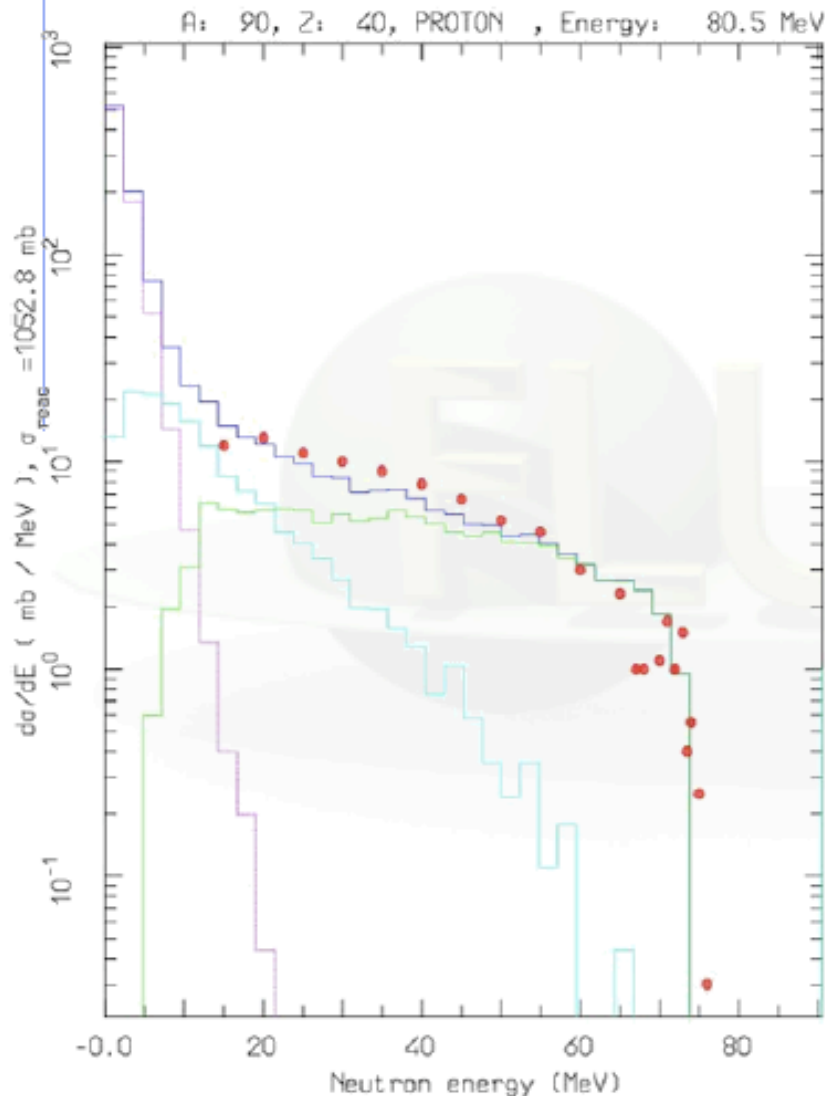
any partition of the excitation energy  $E^*$  among  $N$ ,  $N = N_h + N_p$ , excitons has the same probability to occur

Step: nucleon-nucleon collision with  $N_{n+1} = N_n + 2$  ("never come back approximation")

Chain end = equilibrium =  $N_n$  sufficiently high or excitation energy below threshold

*$N_1$  depends on the reaction type and cascade history*

# Thin target example



Angle-integrated  $^{90}\text{Zr}(p,xn)$  at 80.5 MeV

The various lines show the total, INC, preequilibrium and evaporation contributions

Experimental data from M. Trabandt et al., Phys. Rev. C39, 452 (1989)

## Equilibrium particle emission (evaporation, fission and nuclear break-up)

From statistical considerations and the detailed balance principle, the probabilities for emitting a particle of mass  $m_j$ , spin  $S_j \hbar$  and energy  $E$ , or of fissioning are given by:

( $i, f$  for initial/final state,  $F_{\text{Fiss}}$  for fission saddle point)

Probability per unit time of emitting a particle  $j$  with energy  $E$

$$P_j = \frac{(2S_j + 1)m_j c}{\pi^2 \hbar^3} \int_{V_j}^{U_i - Q_j - \Delta_j} \frac{\rho_f(U_f)}{\rho_i(U_i)} \sigma_{\text{inv}}(E) E dE$$

Probability per unit time of fissioning

$$P_{\text{Fiss}} = \frac{1}{2\pi\hbar} \int_0^{U_i - B_{\text{Fiss}}} \frac{\rho_{\text{Fiss}}(U_i - B_{\text{Fiss}} - E)}{\rho_i(U_i)} dE$$

- $\rho$ 's: nuclear level densities
- $U$ 's: excitation energies
- $V_j$ 's: possible Coulomb barrier for emitting a particle type  $j$
- $B_{\text{Fiss}}$ : fission barrier

- $Q_j$ 's: reaction  $Q$  for emitting a particle type  $j$
- $\sigma_{\text{inv}}$ : cross section for the inverse process
- $\Delta$ 's: pairing energies

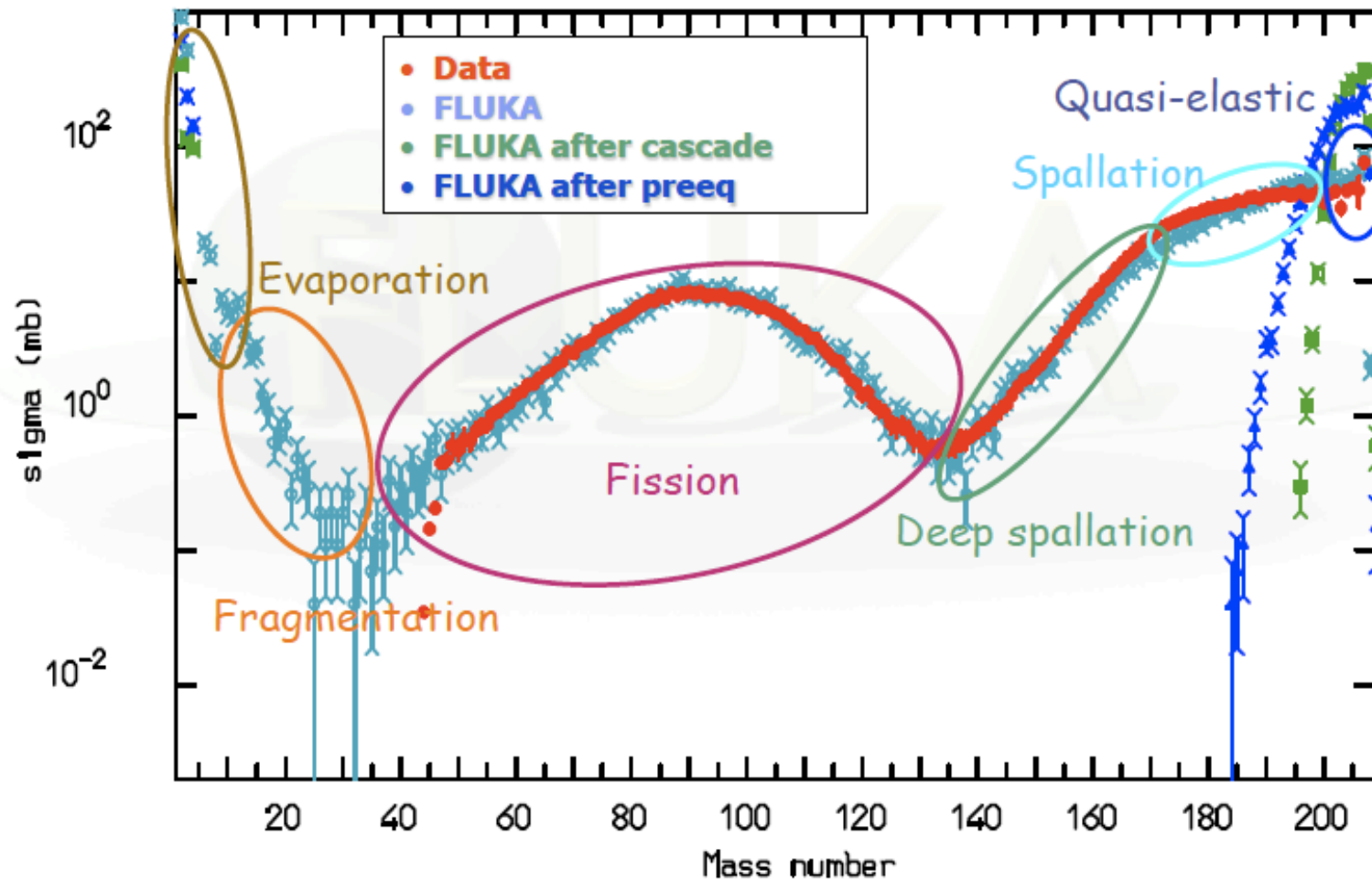
*Neutron emission is strongly favoured because of the lack of any barrier  
Heavy nuclei generally reach higher excitations because of more intense cascading*

# Equilibrium particle emission

- Evaporation: Weisskopf-Ewing approach
  - ~600 possible emitted particles/states ( $A < 25$ ) with an extended evaporation/fragmentation formalism
  - Full level density formula with level density parameter  $A, Z$  and excitation dependent
  - Inverse cross section with proper sub-barrier
  - Analytic solution for the emission widths (neglecting the level density dependence on  $U$ , taken into account by rejection)
  - Emission energies from the width expression with no. approx.
- Fission: past, improved version of the Atchison algorithm, now
  - $\Gamma_{fis}$  based of first principles, full competition with evaporation
  - Improved mass and charge widths
  - Myers and Swiatecki fission barriers, with exc. en. Dependent level density enhancement at saddle point
- Fermi Break-up for  $A < 18$  nuclei
  - ~ 50000 combinations included with up to 6 ejectiles
  - $\gamma$  de-excitation: statistical + rotational + tabulated levels

# Example of fission/evaporation

1 A GeV  $^{208}\text{Pb} + \text{p}$  reactions Nucl. Phys. A 686 (2001) 481-524



## Heavy ion interaction models in FLUKA - 1

$E > 5 \text{ GeV/n}$

Dual Parton Model (DPM)

DPMJET-III (original code by R.Engel, J.Ranft and S.Roesler,  
FLUKA-implementation by T.Empl *et al.*)

$0.1 \text{ GeV/n} < E < 5 \text{ GeV/n}$

Relativistic Quantum Molecular Dynamics Model (RQMD)

RQMD-2.4 (original code by H.Sorge *et al.*,  
FLUKA-implementation by A.Ferrari *et al.*)

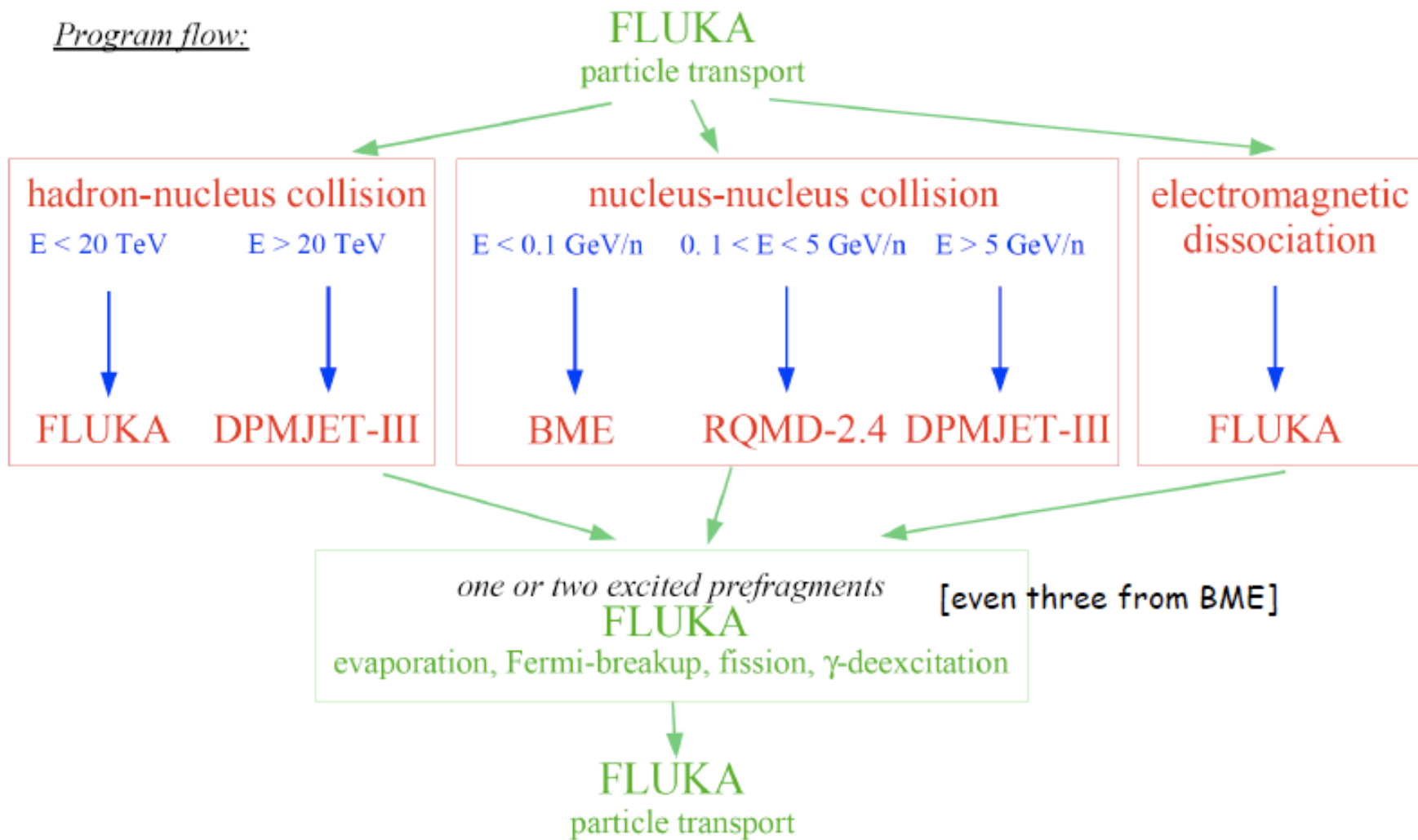
$E < 0.1 \text{ GeV/n}$

Boltzmann Master Equation (BME) theory

BME (original code by E.Gadioli *et al.*,  
FLUKA-implementation by F.Cerutti *et al.*)

## Heavy ion interaction models in FLUKA - 2

Program flow:



## RQMD

$E > 5 \text{ GeV/n}$

Dual Parton Model (DPM)  
DPMJET-III (original code by R.Engel, J.Ranft and S.Roesler,  
FLUKA-implementation by T.Empl *et al.*)

$0.1 \text{ GeV/n} < E < 5 \text{ GeV/n}$

Relativistic Quantum Molecular Dynamics Model (RQMD)  
RQMD-2.4 (original code by H.Sorge *et al.*,  
FLUKA-implementation by A.Ferrari *et al.*)

$E < 0.1 \text{ GeV/n}$

Boltzmann Master Equation (BME) theory  
BME (original code by E.Gadioli *et al.*,  
FLUKA-implementation by F.Cerutti *et al.*)



## RQMD - *References*

interface to a suitably modified **RQMD model**

RQMD-2.4 (H. Sorge, 1998) was successfully applied  
to relativistic A-A particle production over a wide energy range

[H. Sorge, Phys. Rev. **C 52**, 3291 (1995);

H. Sorge, H. Stöcker, and W. Greiner, Ann. Phys. **192**, 266 (1989)

and Nucl. Phys. **A 498**, 567c (1989)]

## RQMD - *The original code*

### The RQMD-2.4 code

**INITIAL CONDITION** two Fermi gases (projectile and target)

$$\text{Fermi momentum } p_{F0} = \hbar \left( 3\pi^2 \frac{A}{2V} \right)^{1/3} \quad V = (4/3) \pi (r_0 A^{1/3})^3 \quad r_0 = 1.12 \text{ fm} \Rightarrow \rho = 0.17 \frac{\text{nucl.}}{\text{fm}^3}$$

$$\text{nucleon momentum } \boxed{p = p_{F0} \left( \frac{\rho(r)}{\rho_0} \right)^{1/3} \epsilon^{1/3}} \quad \epsilon \in [0, 1] \text{ random}$$
$$\phi = 2\pi\epsilon \qquad \cos \theta = 1 - 2\epsilon$$

$$p_x = p \sin \theta \cos \phi \quad - (\sum p_x) / A$$

$$p_y = p \sin \theta \sin \phi \quad - (\sum p_y) / A$$

$$p_z = p \cos \theta \quad - (\sum p_z) / A$$

$$\text{so } \sum p_x = \sum p_y = \sum p_z = 0$$

### FINAL STATE

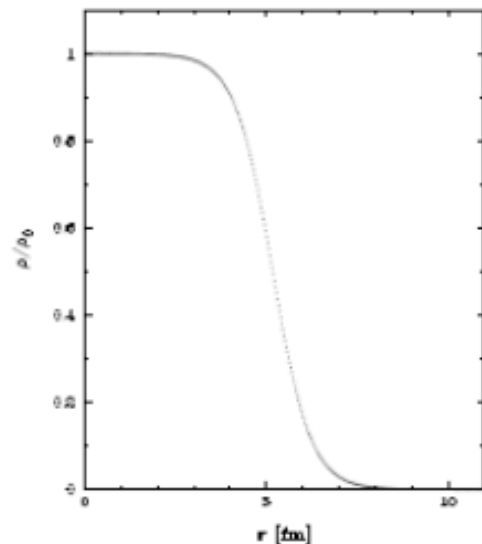
- $(p^0, p_x, p_y, p_z)$  for nucleons (and produced particles) in the LAB frame
- the spectators are marked
- no residue and fragment identification
- energy non-conservation issues, particularly when run in full QMD mode

# RQMD - *The interfaced code*

## Implemented developments

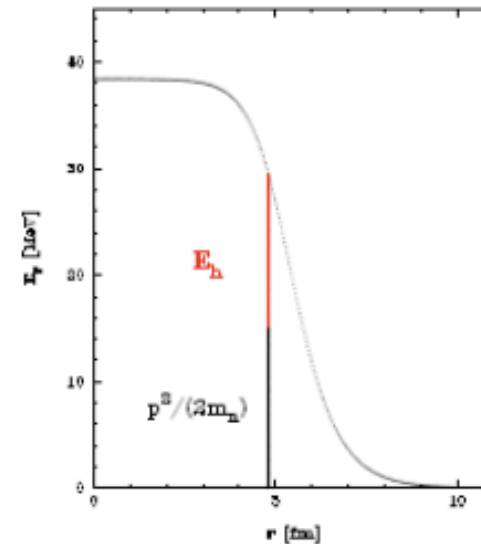
- construct the **projectile- and target-like** nuclei by gathering *spectator* nucleons,

$$\text{assuming } E_{pL}^* = \sum_{\rho a} \rho E_h \quad (TL)$$



$$\rho(r) \propto \left(1 + \exp\left(\frac{r-R}{a}\right)\right)^{-1}$$

$$R = 1.19 A^{1/3} - 1.61 A^{-1/3} \text{ fm} \quad a = 0.52 \text{ fm}$$



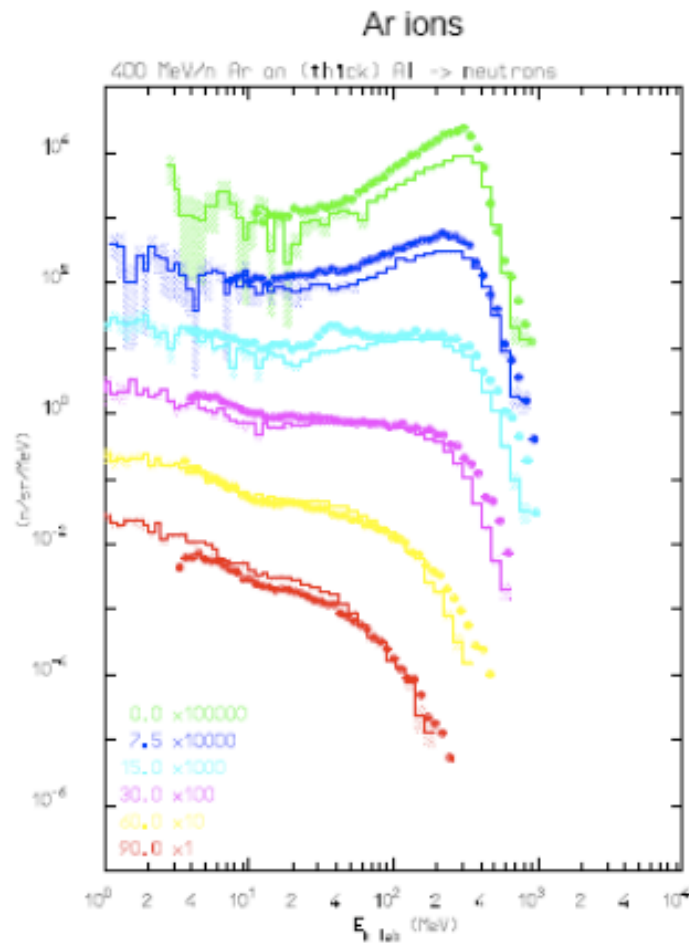
$$E_h = \frac{1}{2m_n} \left\{ \left[ p_{F0} (\rho(r)/\rho_0)^{1/3} \right]^2 - p^2 \right\}$$

$$r, \rho(t=0)$$

- fix the remaining energy-momentum conservation issues taking into account **experimental binding energies**
- use the FLUKA evaporation/fission/fragmentation module

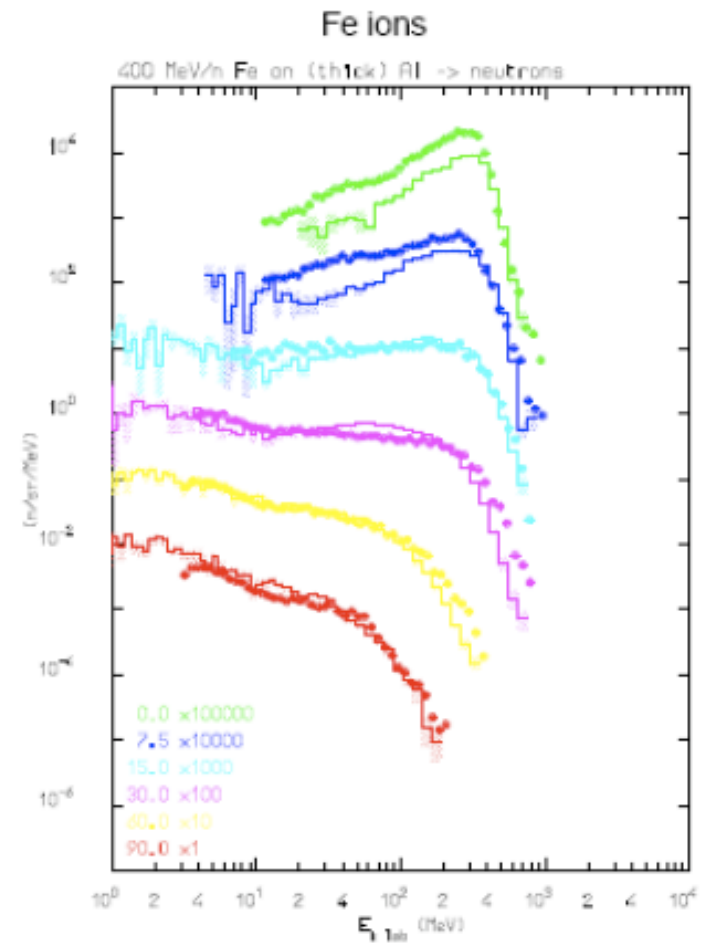
# RQMD - FLUKA benchmarks

## Double differential neutron yield



400 MeV/n

on *thick*  
Al targets



exp. data from T. Kurosawa *et al.*, Phys. Rev. C **62**, 044615 (2000)

## BME

$E > 5 \text{ GeV/n}$

Dual Parton Model (DPM)  
DPMJET-III (original code by R.Engel, J.Ranft and S.Roesler,  
FLUKA-implementation by T.Empl *et al.*)

$0.1 \text{ GeV/n} < E < 5 \text{ GeV/n}$

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FLUKA-implementation by A.Ferrari *et al.*)

$E < 0.1 \text{ GeV/n}$

Boltzmann Master Equation (BME) theory  
BME (original code by E.Gadioli *et al.*,  
FLUKA-implementation by F.Cerutti *et al.*)

## BME - *The interfaced code*

two different reaction paths have been adopted:

### 1. COMPLETE FUSION

$$P_{CF} = \sigma_{CF} / \sigma_R$$

#### **pre-equilibrium**

according to the BME theory

FLUKA evaporation

### 2. PERIPHERAL COLLISION

$$P = 1 - P_{CF}$$

#### **work in progress**

*three body mechanism*

*pickup/stripping (for asymmetric systems at low  $b$ )*

*inelastic scattering (at high  $b$ )*

1. In order to get the multiplicities of the pre-equilibrium particles and their double differential spectra, the BME theory is applied to a few representative systems at different bombarding energies and the results are parameterized.

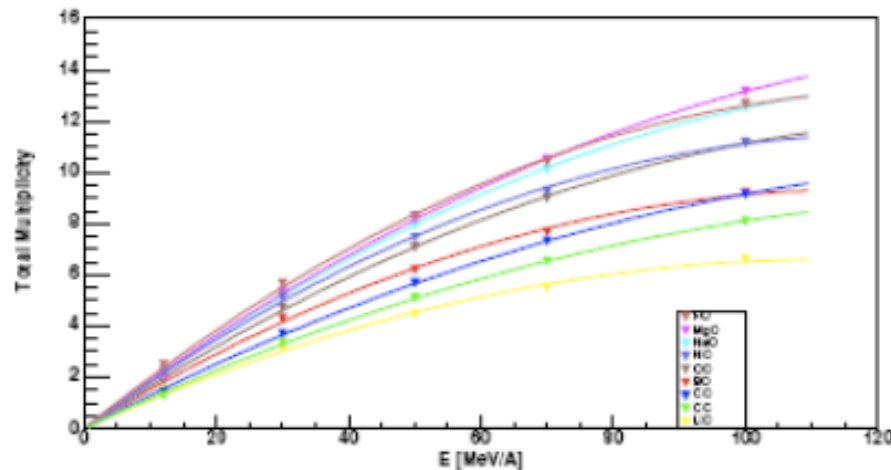
2. The complete fusion cross section decreases with increasing bombarding energy. We integrate the nuclear densities of the projectile and the target over their overlapping region, as a function of the impact parameter, and obtain a preferentially excited "middle source" and two fragments (projectile- and target-like). The kinematics is suggested by break-up studies.

## BME - The database for the pre-equilibrium emissions

$^{16}\text{O} + ^6\text{Li}, ^8\text{Li}, ^8\text{B}, ^{10}\text{B}, ^{12}\text{C}, ^{14}\text{N}, ^{16}\text{O}, ^{19}\text{F}, ^{20}\text{Ne}, ^{24}\text{Mg}, ^{27}\text{Al}, ^{56}\text{Fe}, ^{197}\text{Au}$

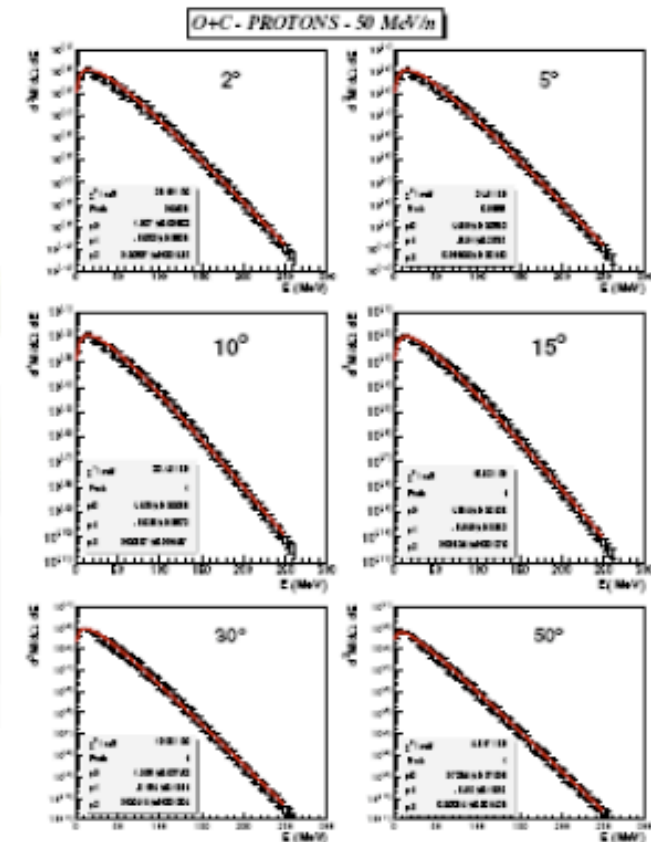
$^{12}\text{C} + ^8\text{Li}, ^8\text{B}, ^{12}\text{C}, ^{27}\text{Al}, ^{40}\text{Ca}$

@ 12, 30, 50, 70, 100 MeV/n



total multiplicity

$$M = P_1 E_{nucl} - P_2 E_{nucl}^2$$



energy spectra

$$\frac{d^2M}{dE d\Omega} = E^{P_0(\theta)} \exp(-P_1(\theta) - P_2(\theta)E)$$

## BME - Theoretical framework

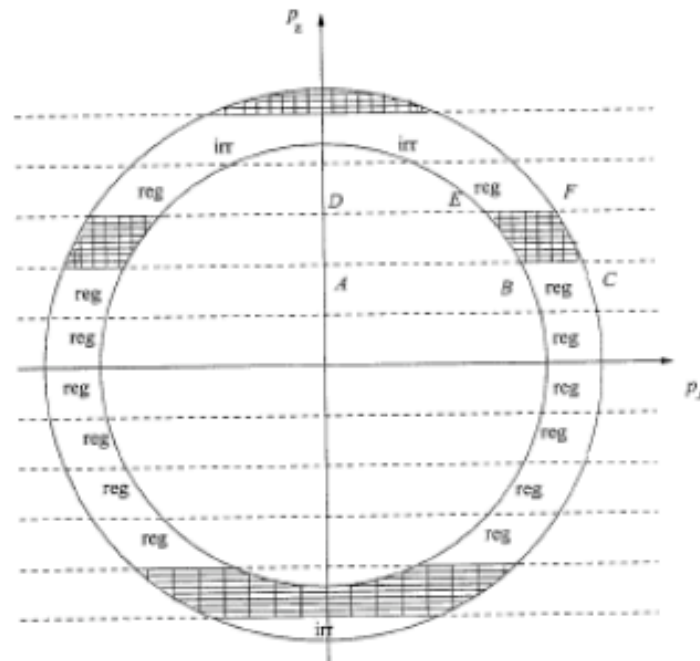
### Calculation of preequilibrium for the composite nucleus

proton and neutron momentum spaces divided into **bins**

$$\left\{ (p_x, p_y, p_z) : p_z \in [p_{zi}, p_{zi} + \Delta p_z), \varepsilon = (2m)^{-1} (p_x^2 + p_y^2 + p_z^2) \in [\varepsilon_i, \varepsilon_i + \Delta\varepsilon) \right\}$$

(**Z** is the beam direction)

of volume  $2\pi m \Delta\varepsilon \Delta p_z$



## BME - Theoretical framework

### The BME system

$$N_i = n_i g_i$$

nucleon number
occupation probability
number of states in bin  $i$

$$\begin{aligned} \frac{d(n_i^\pi g_i^\pi)}{dt} = & \sum_{jlm} [\omega_{lm \rightarrow ij}^{\pi\pi} g_i^\pi n_i^\pi g_m^\pi n_m^\pi (1 - n_i^\pi)(1 - n_j^\pi) \\ & - \omega_{ij \rightarrow lm}^{\pi\pi} g_i^\pi n_i^\pi g_j^\pi n_j^\pi (1 - n_l^\pi)(1 - n_m^\pi)] \\ & + \sum_{jlm} [\omega_{lm \rightarrow ij}^{\pi\nu} g_i^\pi n_i^\pi g_m^\nu n_m^\nu (1 - n_i^\pi)(1 - n_j^\nu) \\ & - \omega_{ij \rightarrow lm}^{\pi\nu} g_i^\pi n_i^\pi g_j^\nu n_j^\nu (1 - n_l^\pi)(1 - n_m^\nu)] \\ & - n_i^\pi g_i^\pi \omega_{i \rightarrow i'}^\pi g_{i'}^\pi \delta(\epsilon_i^\pi - \epsilon_{i'}^\pi - \epsilon_F^\pi - B^\pi) - \frac{dD_i^\pi}{dt} \end{aligned}$$

## BME - Theoretical framework

### Multiplicity spectra

of emitted **nucleons**

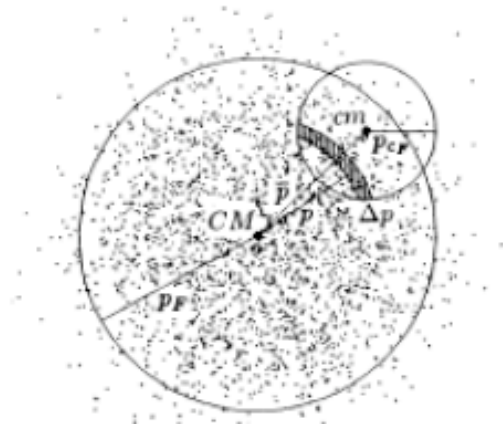
$$\frac{d^2 M(\varepsilon', \theta)}{d\varepsilon' d\Omega} = \frac{1}{2\pi \sin \theta} \int_0^{t_{eq}} n(\varepsilon, \theta, t) \frac{\sigma_{inv} V}{V} \rho(\varepsilon', \theta) dt$$

of a **cluster c**

$$\frac{d^2 M_c(\mathbf{E}'_c, \theta_c)}{d\mathbf{E}'_c d\Omega} = \frac{R_c}{2\pi \sin \theta} \int_0^{t_{eq}} N_c(\mathbf{E}_c, \theta_c, t) \frac{\sigma_{inv,c} V_c}{V} \rho_c(\mathbf{E}'_c, \theta_c) dt$$

$$N_c(\mathbf{E}_c, \theta_c, t) = \prod_i (n_i^\pi(\varepsilon, \theta, t))^{P_i(\mathbf{E}_c, \theta_c) Z_c} \cdot \prod_i (n_i^\nu(\varepsilon, \theta, t))^{P_i(\mathbf{E}_c, \theta_c) N_c}$$

joint probability



## BME - Peripheral collisions

i. selection of the *impact parameter*  $b$

ii. kinematics determination

$\theta_{PL}, \theta_{TL}$  chosen according to  $[d\sigma/d\Omega]_{cm} \sim \exp(-k\theta_{cm})$

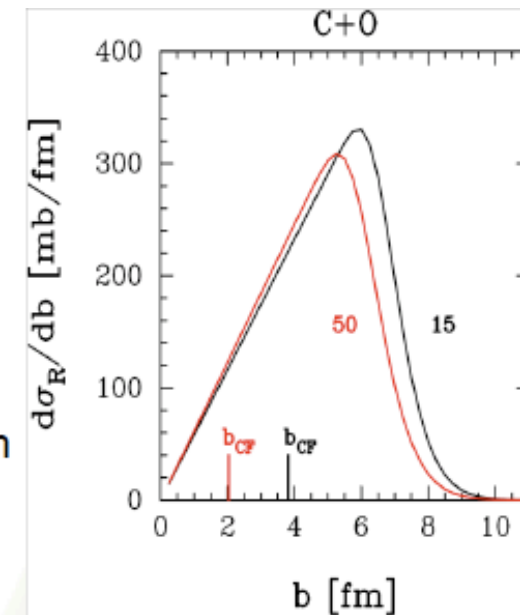
$\theta_{MS}$  momentum conservation

$p_{PL}, p_{TL}$  chosen according to a given energy loss distribution

$p_{MS}$  momentum conservation

$\phi_{PL}$  free

$\phi_{TL}, \phi_{MS}$  same reaction plane



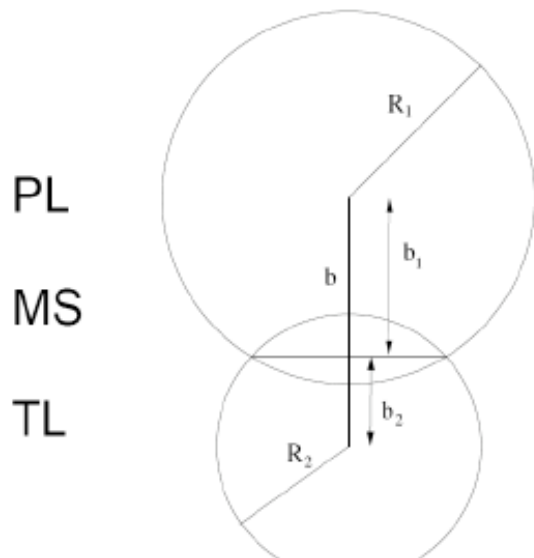
**work in progress**

iii. excitation energy sharing

$$E_{MS}^* = (A_{MS}/A_{tot})E_{tot}^* \sum_{n=0}^k (1 - A_{MS}/A_{tot})^n$$

$$E_{PL}^* = f(A_{PL}, A_{TL}) (E_{tot}^* - E_{MS}^*)$$

$$E_{TL}^* = (E_{tot}^* - E_{MS}^* - E_{PL}^*)$$



PL

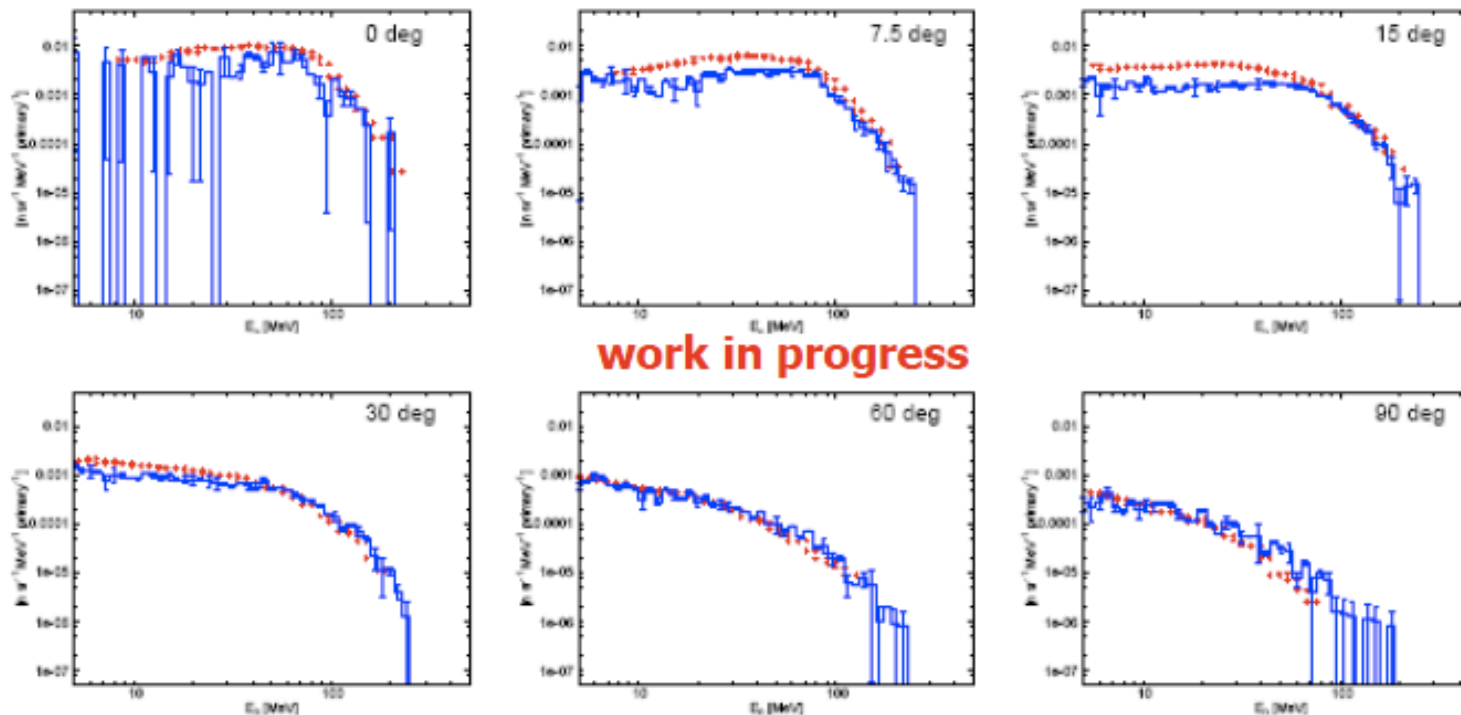
MS

TL

## BME - Benchmarking

### Double differential neutron yields from thick targets

exp. data from T. Kurosawa, N. Nakao, T. Nakamura *et al.*, Nucl. Sci. Eng. 132, 30-57 (1999)



100 MeV/n  $^{12}\text{C}$  ions on C target



# Material sources:

- ❖ **“Advanced dosimetric concepts for radiation therapy”**  
Dr K Parodi, Heidelberg, Germany
- ❖ **FLUKA Course Material ([www.fluka.org](http://www.fluka.org))**