

# Towards efficient and accurate particle transport simulation in medical applications

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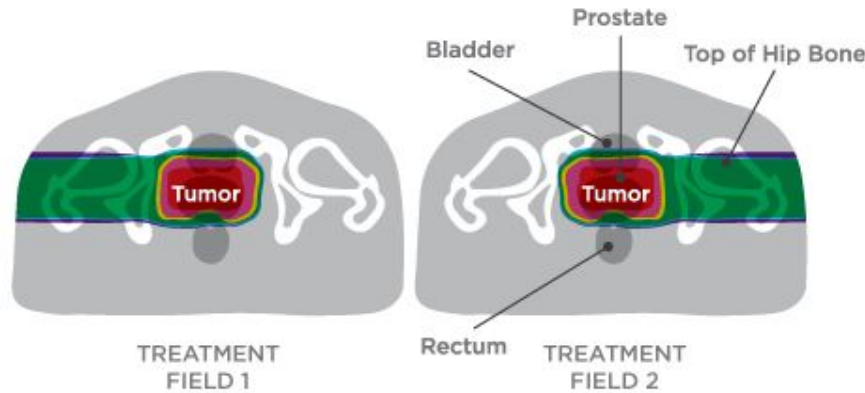
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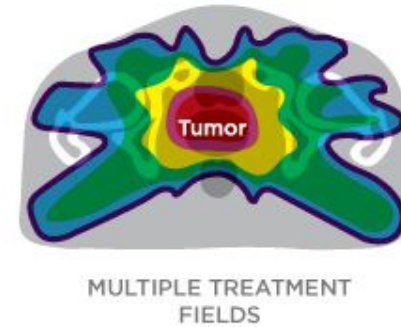


# Cancer and radiotherapy

## PROTONS



## CONVENTIONAL RADIATION



*These images show the areas exposed to radiation during treatment.*



- New and innovative technique
- Rare (1 center in Poland)
- <200 patients per year
- Proton beam generated by cyclotron - large facility
- No exit-beam, more healthy tissue spared
- More complexity in physics of the beam
- Long history
- Popular (~120 accelerators)
- ~70000 patients per year
- Beam of X-rays, compact linear accelerator in use
- Simpler physics involved

# Proton therapy is booming

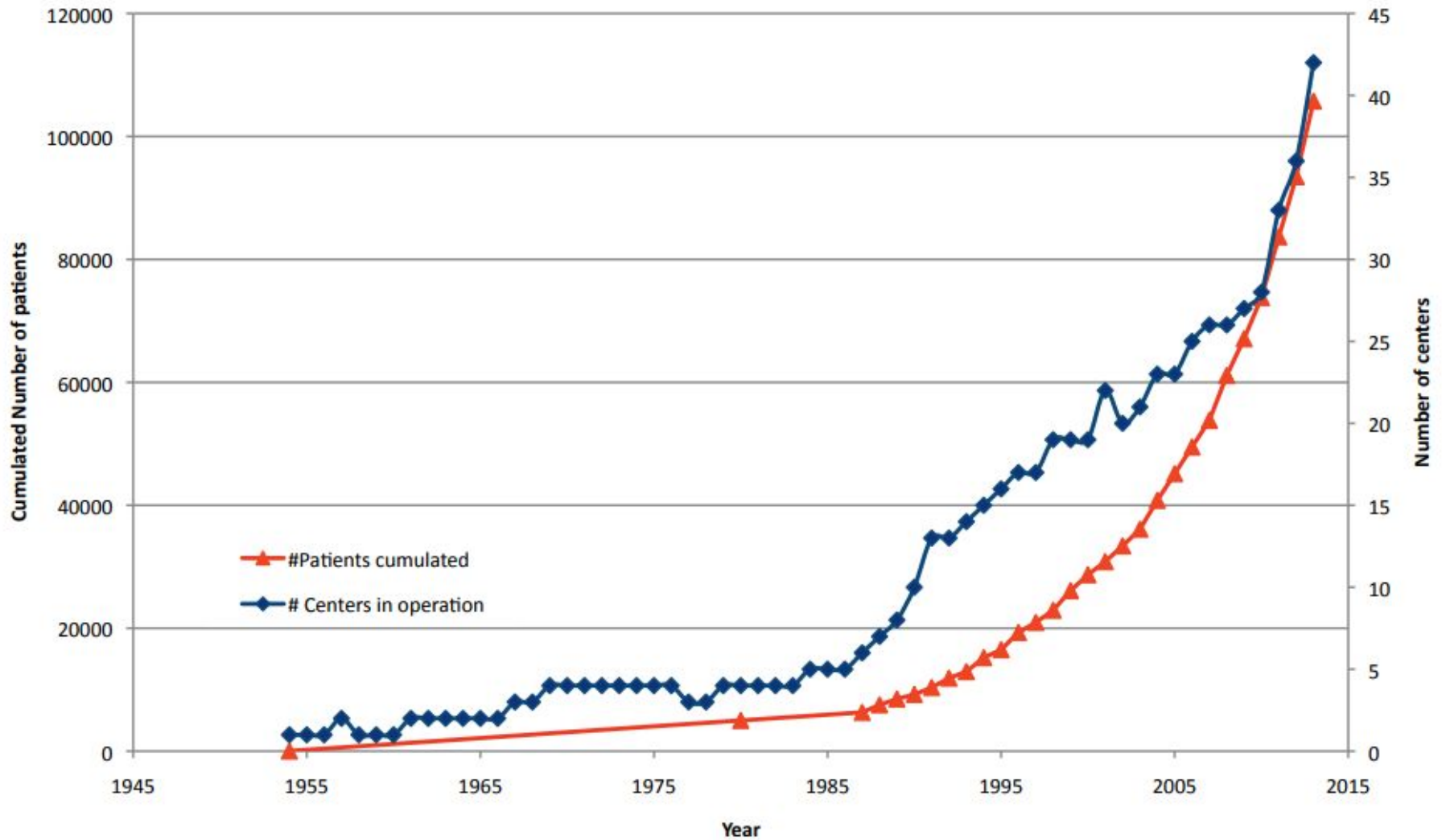


Figure 1.1: Graph representing the evolution of proton therapy centers under clinical operation and the cumulated number of patients treated using proton therapy (Source: PTCOG Website)

# Cyclotron Center Bronowice in Krakow

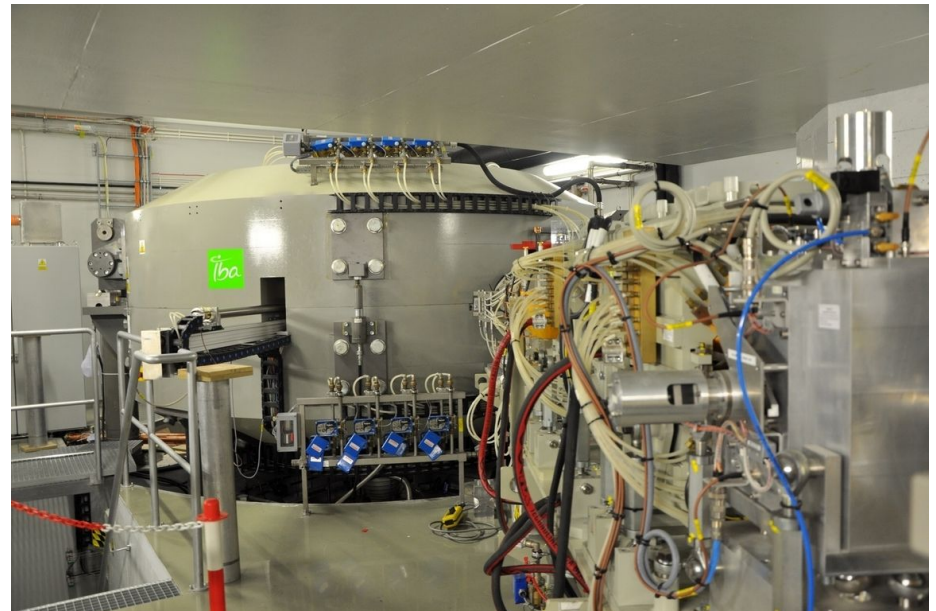


- 1990 - proton therapy plans
- 2009 - CCB project starts
- 2011 - first patients with eye tumors
- 2012 - new cyclotron and building
- 2016 - first patient treated on gantry

Robotic gantry rotates around the patient

Cyclotron delivers beam of protons with max energy 230 MeV (~30 cm range in water)

CCB: patient treatments, experimental physics research, applied physics



# Monte Carlo Simulation of a proton beam

## Aim:

simulate proton beam:

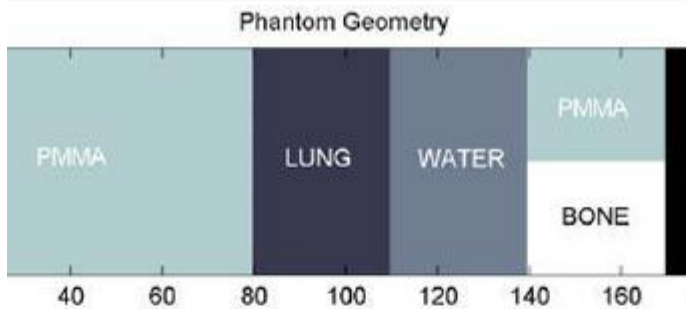
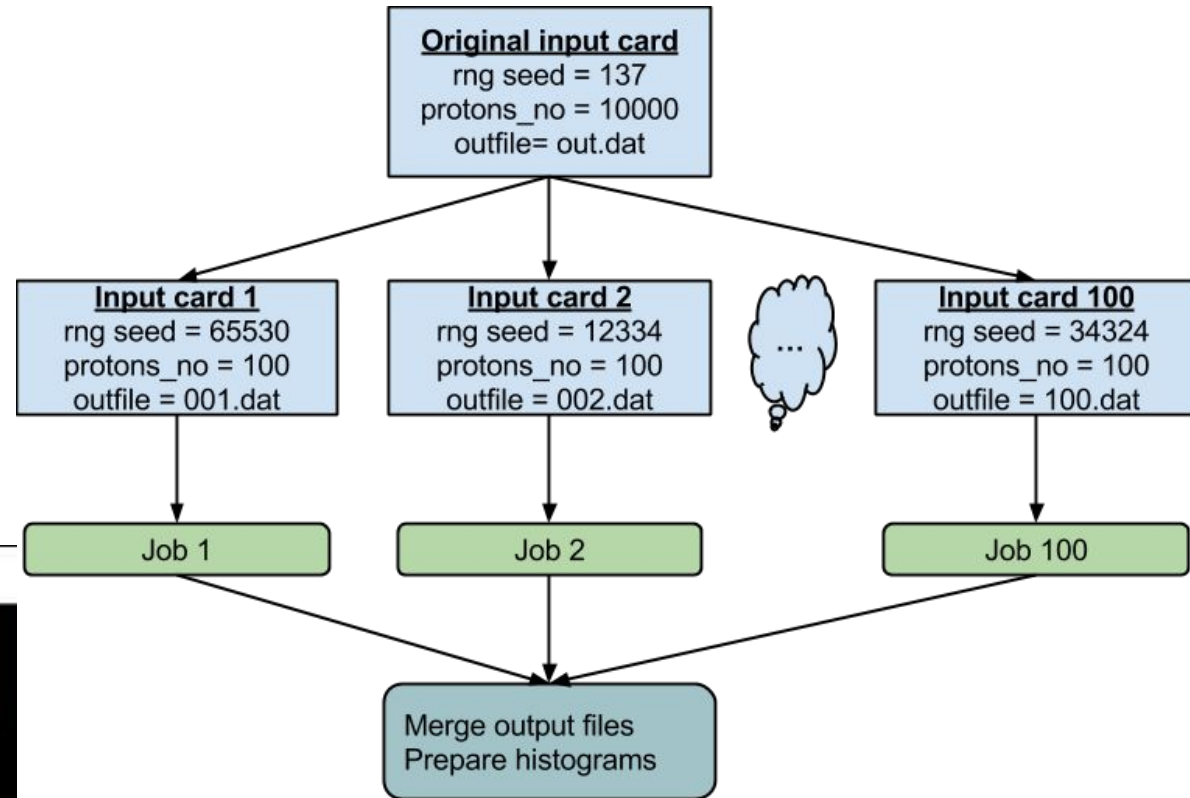
- dose spatial distribution
- complex (patient) geometry

## Tools:

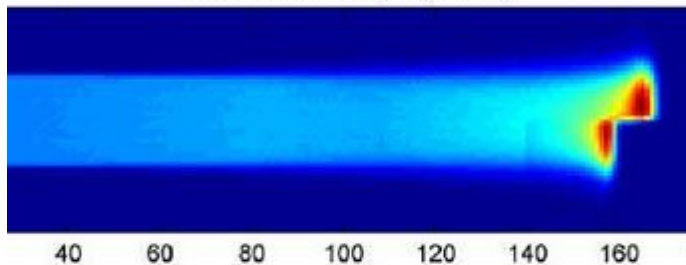
Monte Carlo transport codes:

- Fluka 2011.2
- Geant4.96

Time consuming simulation of particle interactions with matter



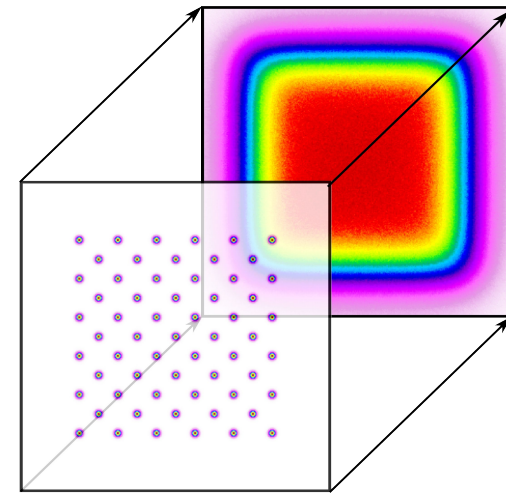
Dose Distribution (mGy mm<sup>2</sup>)



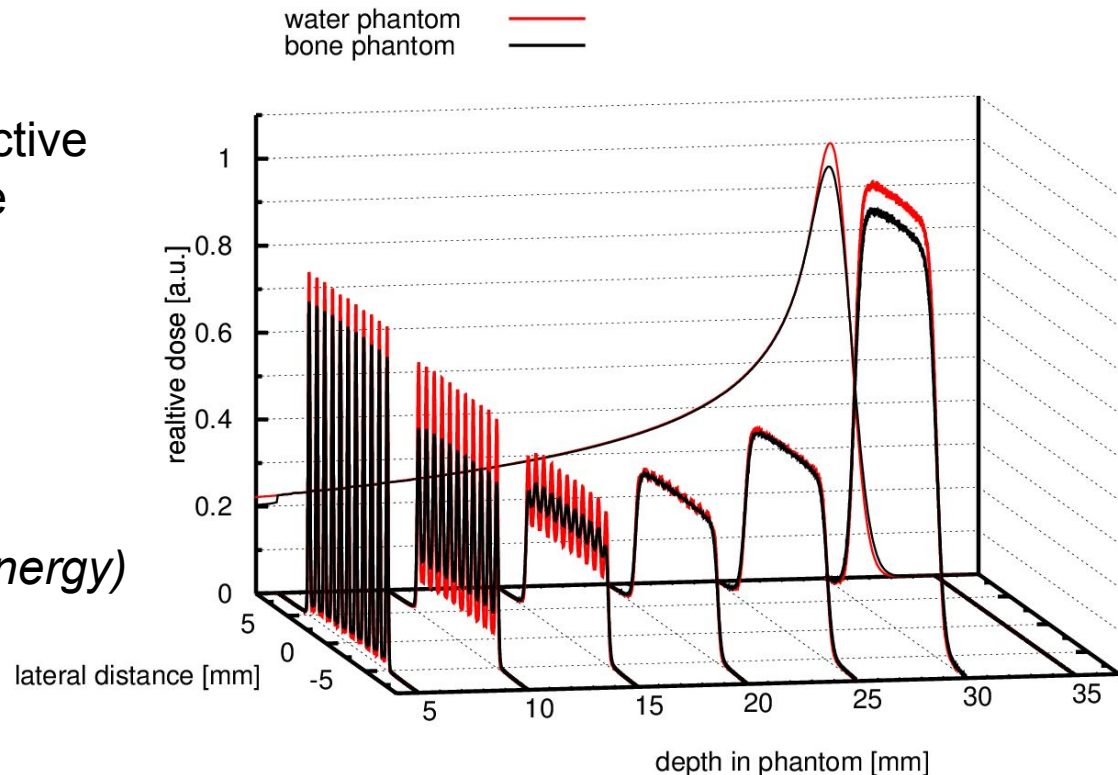
*(Embarrassingly) parallelization - procedure*

# Proton microbeam radiotherapy

- New concept: broad beam filtered by slits.  
Close to skin damage in narrow channels - benefit from dose-volume effect.  
Beam scattering with depth.



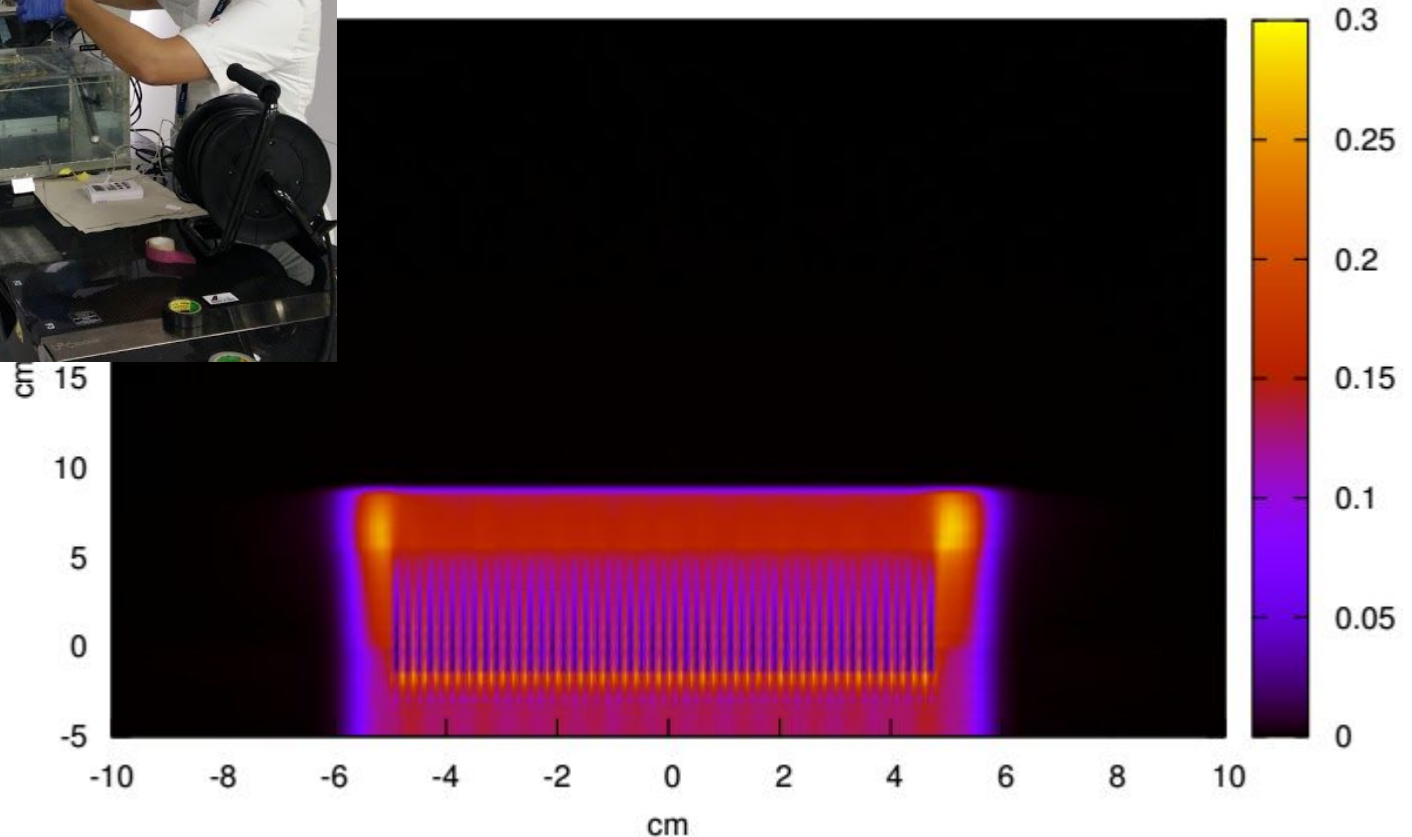
- FLUKA MC code:  
100  $\mu\text{m}$  proton beam with active pencil-beam scanning mode  
60-120 MeV,  
1-8 mm beam spacing  
  
 *$10^5$  protons/spot  
in 10 runs (60-221 spots / energy)*



# Proton spatially fractionated radiotherapy

$5 \cdot 10^8$  particles simulated (SHIELD-HIT12A code)  
500 parallel jobs, each 6 hours of CPU time

Dose



Simulation of dose distribution delivered by beam available in CCB (IFJ PAN Krakow), filtered by 1mm slit collimator. Geometry represents setup used in radiobiology experiment.

# Verification of a proton pencil beam model in the treatment planning system (TPS)

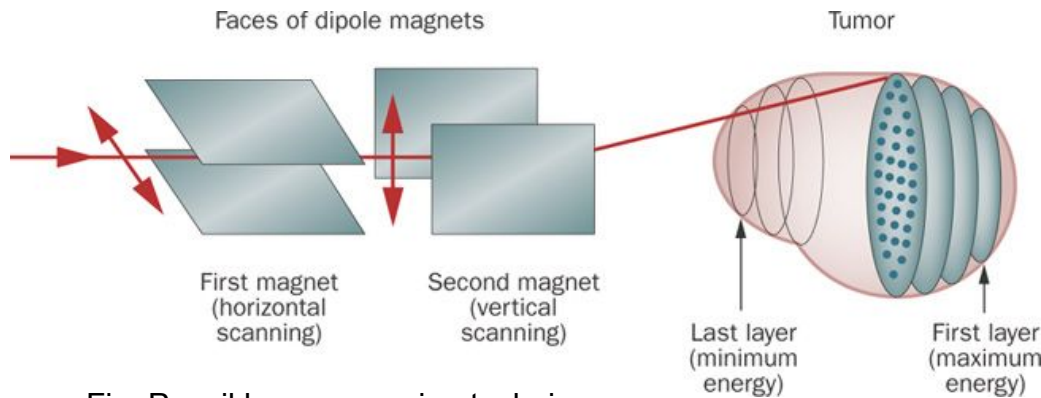


Fig. Pencil beam scanning technique.

<http://www.nature.com/nrclinonc/journal/v7/n1/images/nrclinonc.2009.183-f4.jpg>

Parameters like **position**, **energy** and **weight** of each **proton pencil beam** are calculated in the treatment planning system (TPS) and optimized to achieve uniform dose distribution in the tumour while sparing healthy organs in close region to the irradiated volume.

## Dose distribution calculated in the TPS



TPS - analytical algorithms based on **simplified** physical models (gaussian scattering in water and air). Some disagreement with measurement is observed.

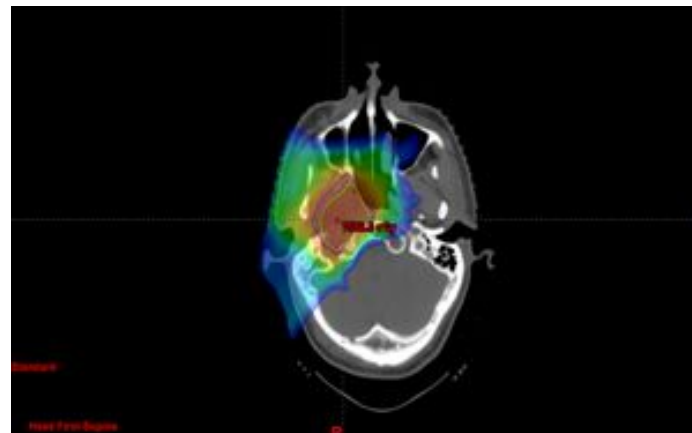


Fig. Dose distribution calculated in the treatment planning system.



# Verification of a proton pencil beam model in the treatment planning system (TPS)

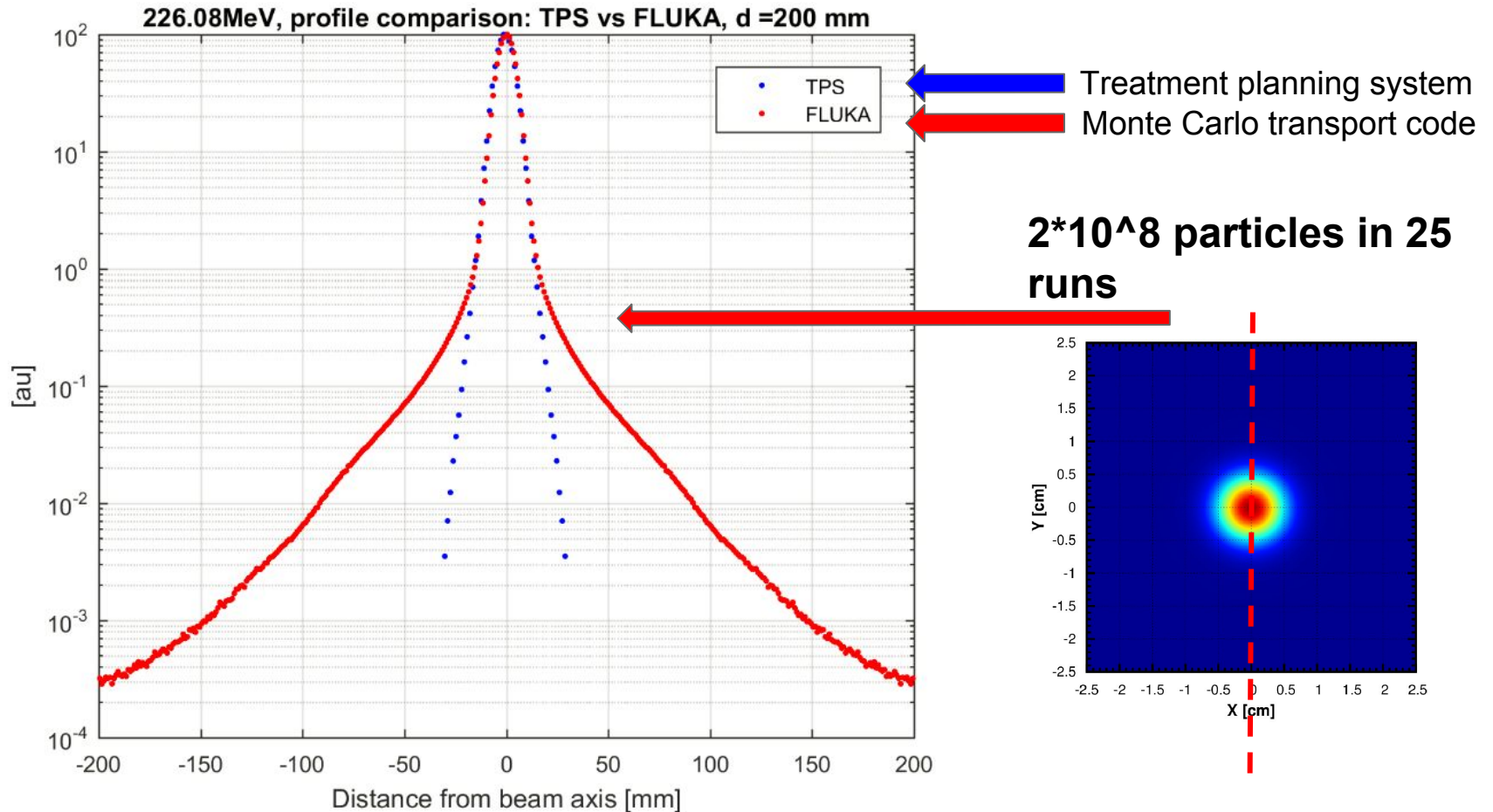
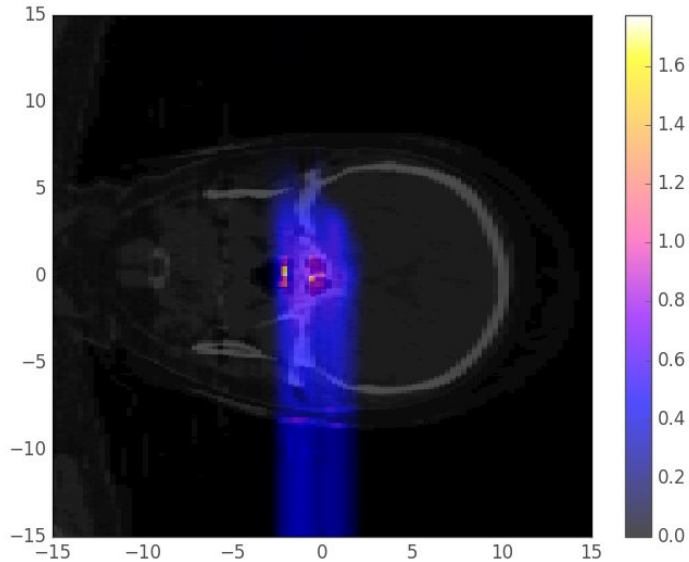


Fig. Lateral beam profiles in water at depth of 200 mm of a single pencil beam of energy 226.08 MeV calculated in FLUKA Monte Carlo code and in Eclipse treatment planning system.

# Towards Monte-Carlo based treatment planning



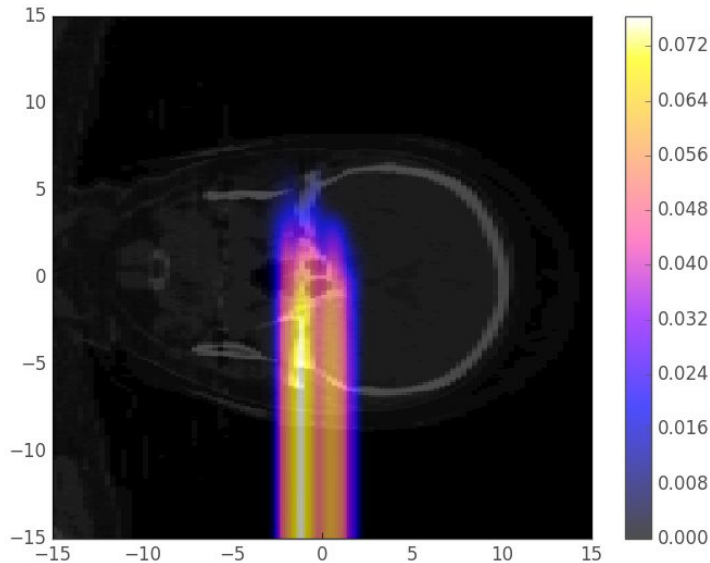
Simulations of particle interaction in geometries based on patient CT scans.

Novel algorithm implemented in SHIELD-HIT12A MC transport code.

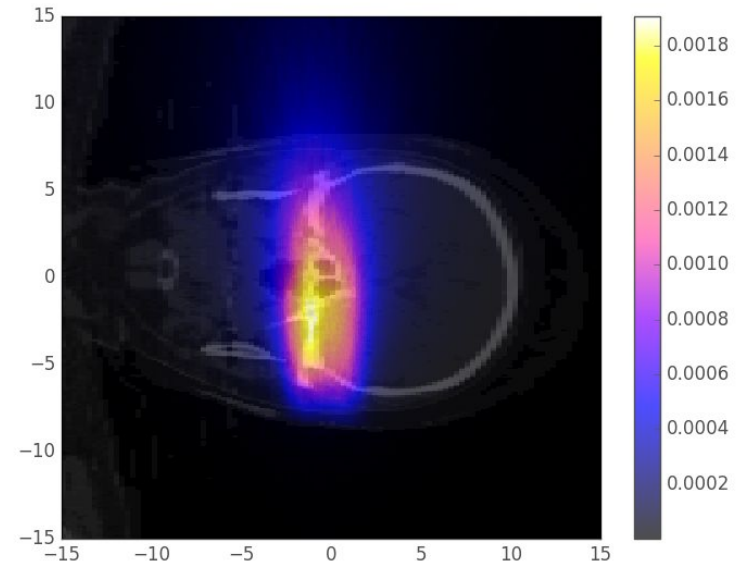
Time and memory consuming calculations:

- ~ 10GB RAM per node
- $10^8$  particles
- 3h of CPU time on 100 nodes

Dose distribution



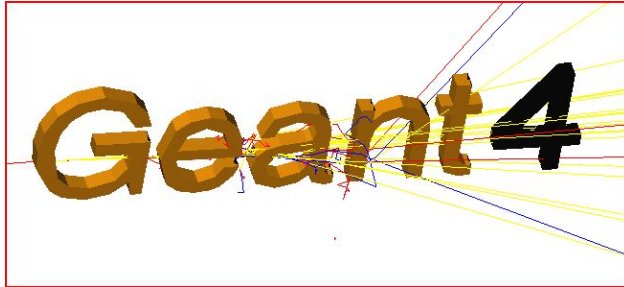
Proton fluence



Neutron fluence

# Ecosystem of tools, codes and projects

Monte Carlo particle transport codes:



Tools and toolkits essential for users

DataMedSci / **pymchelper**

Code

Issues 33

Pull requests 3

Project

Python toolkit for SHIELD-HIT12A and FLUKA

New Add topics

91 commits

22 branches

DataMedSci / **mcpartools**

Code

Issues 7

Pull requests 1

Project

Set of tools to parallelize MC tools on clusters

New Add topics

43 commits

14 branches

pytrip / **pytrip**

Code

Issues 46

Pull requests 1

Project

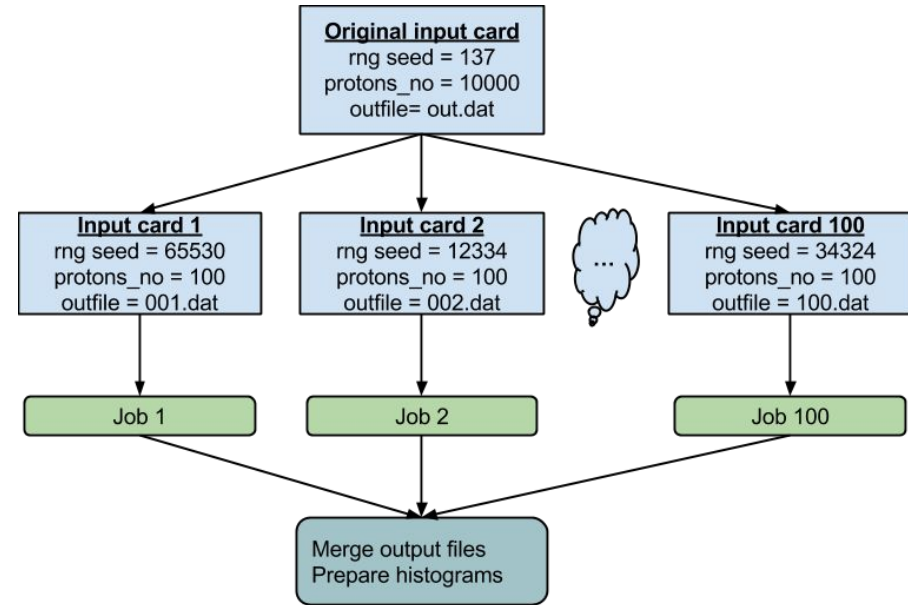
Python bindings for TRiP98, radiotherapy treatment p

New Add topics

152 commits

20 branches

# Simplifying “embarrassing” parallelization



Development: L. Grzanka, A. Rudnicka

```
→ generatemc -j 100 -p 10000 beam.conf
```

Single-file executable  
(no external deps)

No of jobs

Particles per  
job

Input file

# Minimizing total computing time

How to parallelize ?

- $10^6$  protons on 1000 nodes, or
- $10^7$  protons on 100 nodes, or
- $10^8$  protons on 10 nodes ?

Concept from <https://arxiv.org/pdf/1009.5282.pdf>

Implementation in mcpartools - in progress  
(P. Ociepa)

$$T(n) = \frac{\alpha p}{n} + \beta n + \gamma$$

$T(n)$  - total computing time

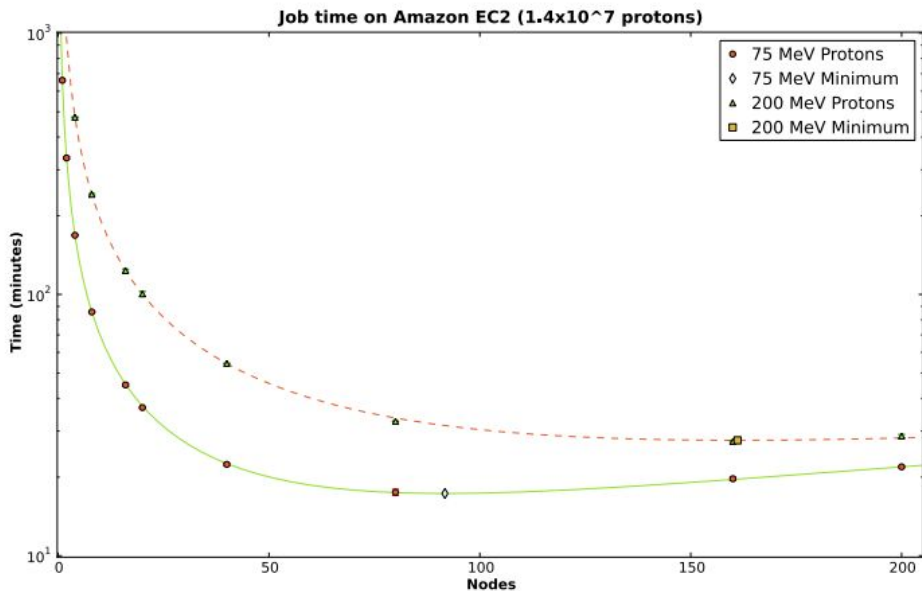
$n$  - number of nodes

$p$  - number of particles

$\alpha$  - calc. time per particle

$\beta * n$  - initialization and merging results  
time (linear)

$\gamma$  - initialization time (fixed)



**Figure 4.** Calculation time versus number of virtual nodes for proton depth-dose curves on Amazon's EC2 cloud service. The calculation time is modelled with Eq.1.

**Thank you for attention !**

