WP7 Most likely path (MLP) estimation

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Workpackage 7 scope

- Calorimeter response
- Calorimeter track reconstruction
- Reconstruction of 3D trajectory track vector matching
- 3D stopping power map

Abstract setup of pCT Phantom reconstruction



- Beam, Phantom and Detector descriptions to be modeled in software
- Matching of particles at beam and detector position
- Particle path estimation

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Particle path estimation - Most likely path approach

Reading list:

- R. Schulte et al., Conceptual design of a proton computed tomography system for applications in proton radiation therapy, IEEE Trans. Nucl. Sci. 51, 866872 (2004).
- Schulte et al., A maximum probability proton path formalism for application in proton computed tomography, Med. Phys. 35, 48494856 (2008).
- D Wang et al., On the use of a proton path probability map for proton computed tomography reconstruction (2010)
- S Rit et al., Filtered backprojection proton CT reconstruction along most likely paths (2013)

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Filtered backprojection along most likely path



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 $\bullet\,$ Total energy loss at point in space $\textbf{x}\in\mathbb{R}^3$

$$-\frac{\mathrm{d}E}{\mathrm{d}x} = \eta(\mathbf{x})S(I(\mathbf{x}), E(\mathbf{x}))$$

- η : electron density, S: stopping power, I: ionization potential
- Proton projection integral along path

$$G(E^{in}, E^{out}) = \int_{E^{in}}^{E^{out}} \frac{\mathrm{d}E}{S(I_{water}, E)}$$

- S: stopping power depending on ionization potential I and energy E
- ► ionization potential varries moderately in human tissue, take $I(x) \simeq I_{water} = \text{const}$

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Making radiograph from data set

 $\bullet\,$ Indicators for a set of spatial indices corresponding to a grid of pixels in plane $\perp\,$ main axis

$$h_j(\mathbf{y}) = \left\{egin{array}{cc} 1 & ext{if } \mathbf{y} \in \mathbb{R}^2 ext{is in pixel } j, \ 0 & ext{else.} \end{array}
ight.$$

 Histogram for data from N protons from the same source position @ output detector

$$g_{j}^{out} = \frac{\sum_{i=0}^{N} h_{j}(u_{i}^{out}, v_{i}^{out}) G(E_{i}^{in}, E_{i}^{out})}{\sum_{i=0}^{N} h_{j}(u_{i}^{out}, v_{i}^{out})}$$

Set of radiographs from multiple source positions is the input to the filtered backprojection algorithm

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Generalization

 Histogram for data from N protons from the same source position @ any distance from source



$$g_j(w) = \frac{\sum_{i=0}^{N} h_j(u_i(w), v_i(w)) G(E_i^{in}, E_i^{out})}{\sum_{i=0}^{N} h_j(u_i(w), v_i(w))}$$

ightarrow 3D projection images instead of 2D projection images, the last dimension is related to the distance to the source w

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Results - Depth dependence of spacial resolution



FIG. 3. Simulation 2. Central slice of the pCT reconstruction with distance-driven binning (left) and zooms on the central (right, top line) and peripheric (right, bottom line) inserts indicated with squared boxes. Gray-level range: [0.7, 2]. The first column of zoomed images were obtained with the proposed algorithm and the second and third columns were obtained with the standard FDK algorithm using sinograms binned according to the position of protons at 90 cm (entrance of the phantom) and 110 cm (exit of the phantom) from the source, respectively.

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Results - Spatial resolution of clinical CT scanners



Fig. 4. Simulation 3, full scan. (Top-left) certant axial slice of the standard FDX reconstruction using the 2D set of projection mages g(110 cm) binned according to the position of protost as the exist of the object. (Tord-y-lever large (107, 21), (Top-right) them with the singare most at the exist eff the object. (Bottom-right) distance-driven FDX reconstruction using the complete set of 3D projections g. (Bottom-right) profile along the three segments drawn on each slice.

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Use of proton path probability map



FIG. 2. Illustration of Bayesian inference-based proton path probability estimation. The proton enters at position A and exits at position D. The probability of the proton passing position C is to be estimated. D Wang et al., On the use of a proton path probability map for proton computed tomography reconstruction (2010)

comprehensive mathematical description to extract the proba-

bility map and most likely path



FIG. 5. A typical example of path estimation in 0.25 mm resolution. This path is 24 cm long in its original direction and the lateral deflection is 7.5 mm. (a) Full probability map overlaid with the real path (open squares with dashed line), extracted MLP (stars with dashed line), and CSP (open circles with dashed line), the probability path envelope overlaid with the real path (open squares with dashed line), extracted MLP (stars with dashed line), and CSP (open circles with dashed line).



FIG. 6. Reconstruction of pCT using different proton path estimations. (a) One slice of a pCT image of the Shepp-Logan phantom reconstructed using CSP with bilinear interpolation; (b) the same slice reconstructed using the full probability map; (c) the same slice reconstructed using MLP extracted *A* ○

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Software for the Bergen pCT

- Most of the studies have been published
- We have access to some of the code
- Common software tools existing: ITK, RTK
- How to understand and integrate the software?

Software - Task sequence



- Task sequence to be split into separate packages
- What is our data model for the flow of information?
- Shortcuts of the cycle can be used to test tasks individually

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Software - next steps and milestones

- We should consider WP1 and WP7 together in the software development.
- "Theoretical" work:
 - Setup software packages for the complete cycle
 - Define requirements and specifications for every package
 - ► Define Data model (RAW data, hit/cluster, track, calorimeter data set)
- Practical work:
 - ► Start with a decoder and preliminary visualization for raw data
 - Geometry modeling in an ITK framework
 - Get examples in the Lyon code working
 - ▶ ...
- \vartriangleright My personal take/wish: define realistic milestones for the next three months