

ORIGINAL ARTICLE



Towards harmonizing clinical linear energy transfer (LET) reporting in proton radiotherapy: a European multi-centric study

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ABSTRACT

Background: Clinical data suggest that the relative biological effectiveness (RBE) in proton therapy (PT) varies with linear energy transfer (LET). However, LET calculations are neither standardized nor available in clinical routine. Here, the status of LET calculations among European PT institutions and their comparability are assessed.

Materials and methods: Eight European PT institutions used suitable treatment planning systems with their center-specific beam model to create treatment plans in a water phantom covering different field arrangements and fulfilling commonly agreed dose objectives. They employed their locally established LET simulation environments and procedures to determine the corresponding LET distributions. Dose distributions $D_{1,1}$ and D_{RBE} assuming constant and variable RBE, respectively, and LET were compared among the institutions. Inter-center variability was assessed based on dose- and LET-volume-histogram parameters.

Results: Treatment plans from six institutions fulfilled all clinical goals and were eligible for common analysis. $D_{1,1}$ distributions in the target volume were comparable among PT institutions. However, corresponding LET values varied substantially between institutions for all field arrangements, primarily due to differences in LET averaging technique and considered secondary particle spectra. Consequently, D_{RBE} using non-harmonized LET calculations increased inter-center dose variations substantially compared to $D_{1,1}$ and significantly in mean dose to the target volume of perpendicular and opposing field arrangements ($p < 0.05$). Harmonizing LET reporting (dose-averaging, all protons, LET to water or to unit density tissue) reduced the inter-center variability in LET to the order of 10–15% within and outside the target volume for all beam arrangements. Consequentially, inter-institutional variability in D_{RBE} decreased to that observed for $D_{1,1}$.

Conclusion: Harmonizing the reported LET among PT centers is feasible and allows for consistent multi-centric analysis and reporting of tumor control and toxicity in view of a variable RBE. It may serve as basis for harmonized variable RBE dose prescription in PT.

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Proton therapy; multi-centric study; linear energy transfer (LET); relative biological effectiveness (RBE)

Background

In proton radiotherapy, a generic relative biological effectiveness (RBE) of 1.1 is applied to account for the higher biological effectiveness of protons over photons [1]. However,

particularly for normal tissue, a growing body of clinical evidence shows that RBE in proton therapy (PT) varies with linear energy transfer (LET) [2–7]. This challenges current clinical practice and poses the need to quantify the RBE-

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driving LET in proton treatment plans. However, LET calculations are not yet implemented in clinical treatment planning systems (TPS) [8], which hampers their routine clinical use in the treatment planning process [9].

LET is defined as the expectation value of the energy loss per unit length by a charged particle in material [1,10] and used as a macroscopic measure for radiation quality. LET values are typically derived by analytical computation or Monte Carlo (MC) simulations [11]. While LET values of monoenergetic particles can be determined with high precision, LET calculations based on a computed tomogram (CT) of, e.g., a patient, and for a mixed radiation field of a real clinical machine imply an averaging over the entire energy spectrum of the particles traversing the CT voxel. However, averaging approach and LET reporting are ambiguous and depend on numerous parameters, such as: (A) the weighting in LET averaging (track-averaging vs. dose-averaging), (B) the choice of considered secondary particles, (C) the calculation method (e.g., scoring technique) and (D) the physics model and parameters (e.g., electron production threshold and range cuts, step limits) set in the specific LET simulation environment. The influence of these parameters on averaged LET, hereafter denoted as LET, has been investigated in mono-centric research works [11–16], where their effects can be isolated and investigated systematically. However, despite of their evident impact on LET, so far, no standard has been established for calculating and reporting LET in experiments, in clinical practice or for evaluating patient follow-up data [17,18]. Therefore, it must be evaluated whether the calculation and reporting of LET at different PT centers are coherent for the same treatment planning situation and whether LET distributions can currently be exchanged between centers in addition to dose.

This multi-centric study, including eight European PT institutions capable of center-specific LET simulations, presents a current status of applied frameworks for LET calculation at

European PT institutions. It analyses the variability in institutional LET determination and its impact on variable RBE-weighted dose. A consensus how to harmonize LET reporting is proposed.

Material and methods

All institutions active in work package 9 of the European project *Infrastructure in Proton International Research* (INSPIRE) and technically capable to perform the simulations were eligible to participate and jointly agreed to take part in this multi-centric study (Table 1). Each of the eight institutions independently generated clinical-like treatment plans in a water phantom using a suitable TPS with their center-specific beam model. For a given target volume, treatment plans for three pre-defined beam setups had to comply with strict dose-objectives. Using their center-specific simulation environment available for LET calculations, all institutions provided LET and dose data, which were centrally stored and analyzed.

Treatment planning

Treatment planning was conducted on a CT scan ($1 \times 1 \times 1 \text{ mm}^3$) of a homogeneous water phantom ($40 \times 50 \times 38 \text{ cm}^3$). A coherent set of TPS-specific look-up tables was used to ensure a consistent Hounsfield Unit to material assignment (based on mass density, material composition) and stopping-power ratio prediction among the different TPS and simulation environments used at the participating institutions (Table 1) [32,33]. Every PT institution generated three non-robust pencil beam scanning (PBS) treatment plans that homogeneously dose-cover a cubic target volume ($5 \times 5 \times 5 \text{ cm}^3$) in the water phantom applying single-field uniform dose. The beam arrangements were (A) a single-field spread-out Bragg peak (SOBP), (B) two perpendicular fields and (C)

Table 1. Specification of simulation environments employed for dose and linear energy transfer (LET) calculation ([#]: nonharmonized, ^S: harmonized) and proton therapy system used at each of the eight proton therapy institutions.

Institution	Simulation environment		Nozzle Design	Energy range/ MeV [$E_{\min}$; $E_{\max}$]
	for dose	for LET		
University Proton Therapy Dresden	• RayStation v5.99.50	• RayStation v5.99.50 [8,19] ^{#,S}	IBA Universal Nozzle	[100.0; 226.7]
The Skandion Clinic Danish Center for Particle Therapy Aarhus	• RayStation v8.99.30	• RayStation v8.99.30 [8,20] ^{#,S}	IBA Dedicated Scanning Nozzle Varian ProBeam	[60.0; 226.0] [70.0; 245.0]
	• Eclipse v13.7	• FROG [21,22] [#] • TOPAS v3.5 [23,24] with GEANT4 v10.6 [25] ^S		
Institut Curie	• Eclipse v15.5	• TOPAS v3.5 [23,24] with GEANT4 v10.6 [25] ^{#,S}	IBA Universal Nozzle	[100.0; 226.9]
Christie/Manchester	• Eclipse v15.6.03	• GATE v8.1 [26–28] with GEANT4 v10.3.3 [25] ^{#,S}	Varian ProBeam	[70.0; 245.0]
I-SEE	• PlanIt_v3 [#]	• PlanIt_v3 [29] [#]	PBS sample nozzle	[50.0; 250.0]
	• 4SeePlan research v3_stable ^S	• 4SeePlan_research_version (Bio4Dose) [30] ^S		
GSI Helmholtz Center for Heavy Ion Research	• TRiP98 v1805a	• TRiP98 v1805a ^{#,S} [31]	GSI nozzle	Up to 4.5 GeV
Institute of Nuclear Physics Krakow	• TRiP98 v1310	• TRiP98 v1310 ^{#,S} [31]	IBA Dedicated Scanning Nozzle	[70.0; 226.0]

For definition of harmonized LET, please see section on Simulation of LET.

RayStation, RaySearch Laboratories AB, Stockholm, Sweden; Eclipse, Varian Medical Systems, Palo Alto, CA, USA; FROG: Fast dose Recalculation on GPU (Graphics Processing Unit); TOPAS: TOol for PArticle Simulation; GEANT4: GEometry AND Tracking; GATE: GEANT4 Application for Emission Tomography; TRiP: Treatment planning for Particles.

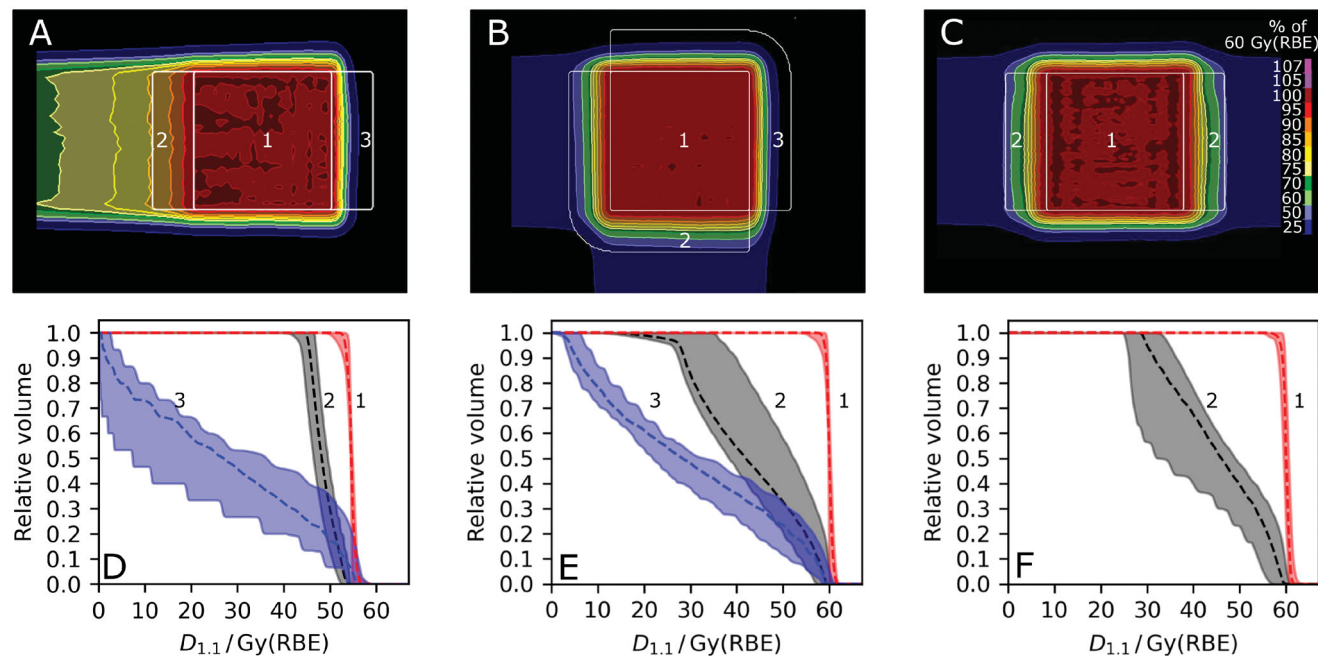


Figure 1. Dose distributions from one institution for a (A) single-field spread out Bragg-Peak, (B) perpendicular and (C) opposing field arrangement, displayed relative to the prescription dose of 60 Gy(RBE). (D), (E), (F) Dose-volume histograms (DVH) of the six institutions for each field arrangement (A), (B), (C), respectively, showing the median (dashed) and the interval from minimum to maximum DVH parameters (shaded area). A constant relative biological effectiveness (RBE) of 1.1 was applied to calculate the biologically equivalent dose ($D_{1.1}$). Regions of interest: (1) target volume, (2) proximal dose build-up region, (3) steep distal dose fall-off region.

Table 2. Specification of linear energy transfer (LET) calculations as implemented at the eight proton therapy institutions.

Method Number	LET definition		Characteristic implementation parameters for LET calculation				used for harmonized reporting [§]
	Averaging	Ions	Scoring technique	Unrestricted (U) or restricted (R)	Scoring in	Normalization	
I	dose	all protons	Method 1 from [11]	U	local material	to unit density tissue	y
II	dose	primary protons	Method from [29]	U	WEPL	to unit density tissue	n
III	dose	$Z = 1$	Method from [34]	U	water	None	n
IV	dose	$Z \leq 2$	Method 'C' from [12]	U	local material	to unit density tissue	y
V	dose	all protons	Method 'C' from [12]	U	water	None	y
VI	track	all protons	Method 'C' from [12]	U	local material	to unit density tissue	y
VII	dose	all protons	Methods from [13,35]	U	local material	None	y
VIII	dose	all protons	Method 1 from [11]	U	water	None	y
IX	dose	all particles	Method from [31,36]	U	water	to unit density tissue	n
X	dose	all particles	Method from [31]	U	local material	None	n
harmonized	dose	all protons		U	• Water or • unit density tissue		

For restricted LET, only delta-electrons below a defined energy or range threshold are scored. For unrestricted LET, all produced delta-electrons are scored and absorbed locally. For definition of harmonized LET, please see section on Simulation of LET.

WEPL: Water Equivalent Path Length; Z: atomic charge.; y: yes; n: no; §: averaging technique and scored ions set to 'dose-averaging' and 'all protons'.

two opposing fields, respectively (Figure 1). The isocentre was at target volume center in 12.5 cm depth for the single-field SOBP and both perpendicular fields and 20 cm for opposing fields. Hence, no range shifter was applied. Prescribed mean dose to the target volume was 60 Gy(RBE) in 30 fractions for each beam arrangement, assuming a constant RBE of 1.1. Biologically equivalent doses using a constant RBE of 1.1 are denoted as $D_{1.1}$. Treatment plans were optimized to cover 94% of the target volume with $100 \pm 1\%$ of the prescription dose ($D_{1.1,94\%} = 100 \pm 1\%$), as well as $D_{1.1,1\%} < 102\%$ and $D_{1.1,99\%} > 98\%$. Distal dose fall-off, defined as the distance between distal 80% and 20% isodose lines, and distance of lateral 50% isodose to the target volume were optimized to be within 5–7 mm and less than

10 mm, respectively. No critical structures had to be spared in treatment planning. Institution-specific grid sizes for scoring of dose and LET were $\leq 2 \times 2 \times 2 \text{ mm}^3$.

Simulation of linear energy transfer

Eight different simulation environments for dose and LET were used and every center used its site-specific, if available, clinical beam model for dose optimization and calculation (Table 1). Each institution used its respective LET simulation environment with its site-specific characteristic MC implementation parameters if applicable (Table 2). LET simulation environment specific parameters available for all institutions are found in Supplement Table A1. Details on the algorithms

for LET calculations can be found elsewhere (cf. references in Tables 1 and 2).

In this multi-centric study, LET calculations were divided in two methodological parts. To assess inter-center variability in LET calculation, in a first step, every center independently employed the LET averaging approach and considered the secondary particles according to their local practice. In the second part of the study, it was jointly concluded to harmonize LET reporting among the institutions. It was jointly decided on applying dose-averaging, considering all protons and scoring the LET to water or to unit density tissue, hereafter also referred to as harmonized LET. Two institutions changed their respective LET simulation environments between the two study parts (Table 1). Namely, one institution changed the applied environment-specific MC implementations from method II to VII and another institution from III to VIII (Table 2).

Plan evaluation

Treatment plan evaluation was performed centrally at one institution. Treatment plans were analyzed as reported, without any rescaling. LET was only evaluated in voxels with a minimum total absorbed dose of 1.82 Gy. Regions of interest were created for the dose build-up proximal to the target and steep dose fall-off distal to the target volume in all CT slices of the target volume and measured 15 mm in beam direction for all field arrangements (Figure 1).

In addition to the defined clinical goals, the dose heterogeneity index (HI)

$$HI = (D_{99\%} - D_{1\%})/D_{\text{mean}} \quad (1)$$

and the dose conformity index (CI)

$$CI = V_{D98\%}/V_{\text{target}} \quad (2)$$

were used as measures of treatment plan acceptability and comparability with $V_{D98\%}$ and V_{target} being the volume encompassed by the 98% isodose line and the target, respectively and $D_{X\%}$ being the dose in X% of the volume in the region of interest. The most homogeneous dose distribution (with an HI in the target volume closest to zero) was used as reference dose distribution for three dimensional global gamma analyses [37] considering the high-dose region (>50 Gy(RBE)). For the gamma pass rate $\gamma_{3,3}$, 3% of the prescribed dose and 3 mm were set as dose and distance to agreement criteria, respectively.

Inter-institutional differences in dose- and LET-volume histogram parameters were assessed by using the relative standard deviation σ_n , defined as one standard deviation divided by the arithmetic mean across the institutions, also known as coefficient of variation. It was observed that $D_{1,1,99\%}$ in the distal region is not well defined as it is sensitive to the dose cutoff set and it was therefore excluded from the analysis. The *in-vitro* data-based model from Wedenberg and others [38] was applied for voxel-wise variable RBE estimation and α/β was set to 2 Gy for the entire water phantom. Hereafter, biologically equivalent doses using a variable RBE are denoted by D_{RBE} . A Levene test with

a significance level of 0.05 was used to compare the variations of center-specific dose-volume parameters for different RBE-weighted doses.

Results

Seven out of eight institutions performed treatment planning for all cases. Six institutions provided their dose and LET results in an inter-operable clinical standard format (DICOM) allowing for an unambiguous common analysis of these six datasets. Results from two centers were, thus, excluded from the quantitative analysis (Methods IX and X, Table 2).

For all three beam arrangements, institutions achieved adequate target coverage ($D_{1,1,94\%} \geq 95.6\%$, $D_{1,1,95\%} \geq 95.1\%$, $D_{1,1,99\%} \geq 92.0\%$) and dose hotspots were within clinical tolerance ($D_{1,1,1\%} \leq 105.4\%$) (Figure 1). Hence, despite minor deviations in DVH parameters compared to the defined study goals, these six treatment plans were deemed acceptable.

$D_{1,1}$ distributions from the different institutions were comparable within the target volume (Figure 1) with maximum relative inter-center variations and absolute differences in dose-volume histogram (DVH) parameters ($D_{1,1,99\%}$, mean $D_{1,1}$, $D_{1,1,1\%}$) of 2.7% and 3.6 Gy, respectively (Supplement Table A2). In the high-dose region (> 50 Gy(RBE)), $\gamma_{3,3}$ pass rates were above 91.8%, except for one single field SOBP dose distribution with a $\gamma_{3,3}$ pass rate of 81.9%. In the target volume, all institutional $D_{1,1}$ distributions were homogeneous ($HI \leq 0.13$) and conformal with deviations from $CI = 1$ generally smaller than 0.16, except for two planning cases of one institution presenting maximum CI deviations of 0.22 and 0.32. In the proximal dose build-up and the steep distal dose fall-off regions, inter-institutional variations in DVH parameters were up to 33.5% and 18.8%, respectively, as they were not explicitly included in plan optimization (Figure 1, Supplement Figure A1).

Compared to $D_{1,1}$, inter-institutional variation increased for D_{RBE} using non-harmonized LET calculations. A significant increase in mean dose variation in the target volume by 5.6 percentage points (pp) and 6.5pp was observed for the perpendicular and opposing field arrangement, respectively. Additionally, variations in non-harmonized D_{RBE} were substantially higher (0.6pp to 10.4pp) than with $D_{1,1}$ for all volume-histogram parameters except for proximal D_{99} of the perpendicular field arrangement (Supplement Table A2).

Center-specific LET reporting differed in the applied LET averaging technique and the considered secondary particle spectrum (Figure 2). While one institution considered track-averaged LET, all others performed dose averaging LET calculations. The different types of secondary particle spectra considered by the centers could be categorized into four groups: (a) only primary protons, (b) all protons, i.e., primary protons and later proton generations, (c) primary protons and all ions with atomic charge $Z = 1$ (protons, deuterons, tritons) and (d) primary protons and all ions with $Z \leq 2$ (protons, deuterons, tritons, alphas). Differences in averaging technique and secondary particle spectra resulted in inter-institutional LET variability (σ_n) in volume-histogram

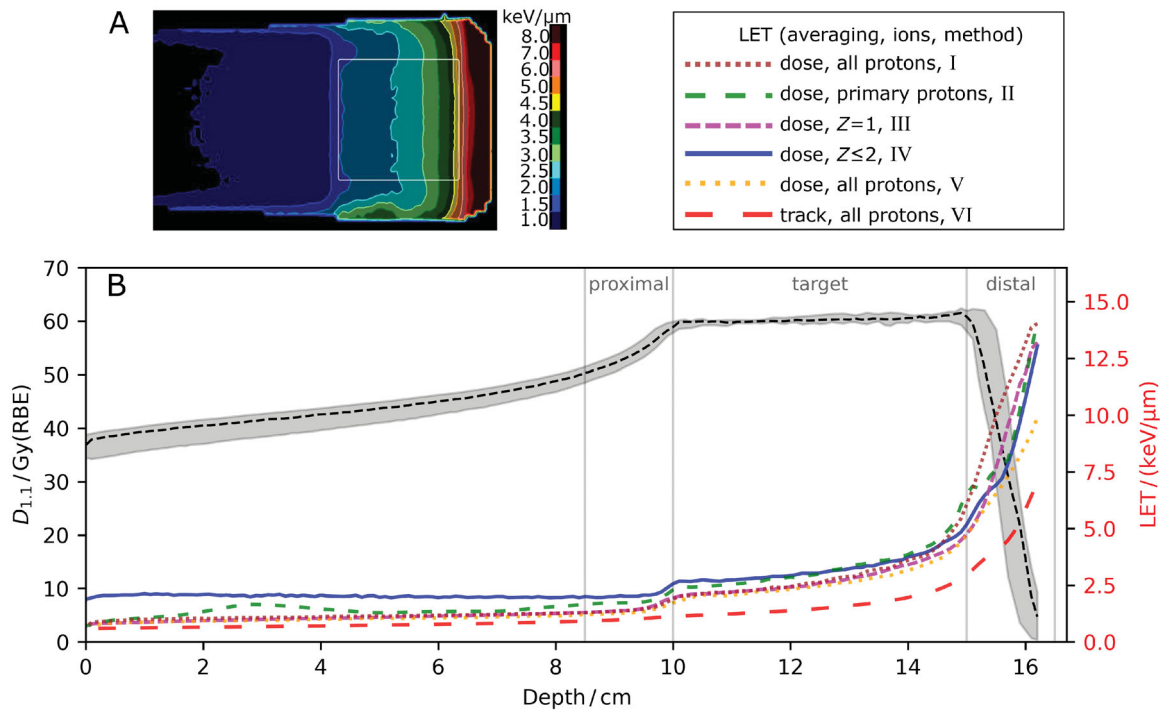


Figure 2. (A) Example of a linear energy transfer distribution (LET, dose-averaged, all protons), corresponding to the dose distribution in Figure 1(A). Line profiles of the six institutions along beam central axis are depicted in (B) for biologically equivalent dose with relative biological effectiveness of 1.1 ($D_{1.1}$, gray, upper) and non-harmonized LET distributions (color-coded, lower). Median $D_{1.1}$ (dashed, black) with minimum and maximum values (shaded area) and detailed depiction of LET line profiles for all six institutional non-harmonized LET calculations show inter-institutional variability. Roman numerals correspond to characteristic implementation parameters for LET calculation according to Table 2. Z: atomic charge.

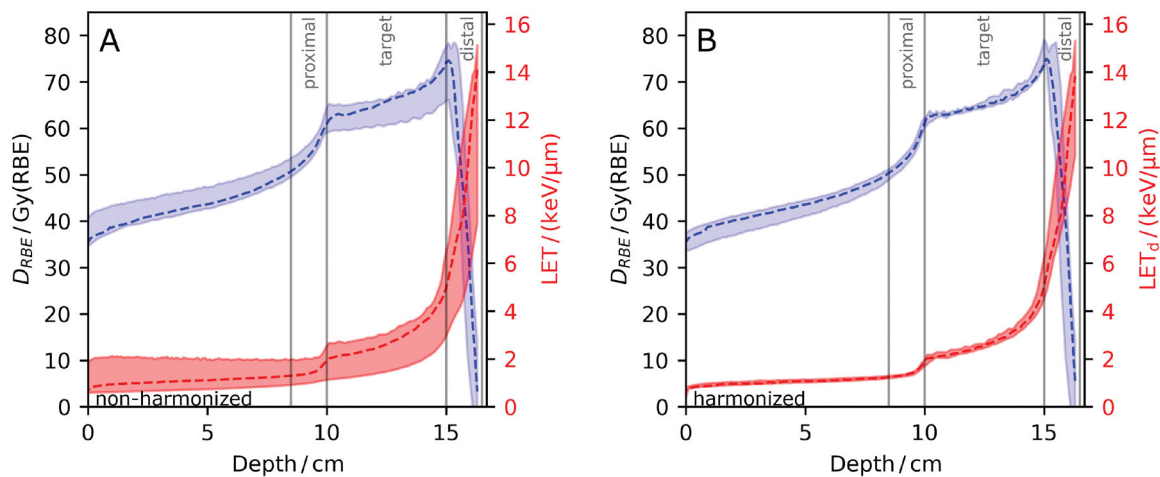


Figure 3. Line profiles from the six institutions along beam-central axis of the single-field spread-out Bragg peak for linear energy transfer (LET, red, lower) and for variable relative biological effectiveness (RBE)-weighted dose (D_{RBE} , blue, upper) considering (A) non-harmonized LET and (B) harmonized LET_d. D_{RBE} was calculated with the Wedenberg RBE model ($\alpha/\beta = 2$ Gy). Median (dashed) D_{RBE} and LET are shown together with their minimum and maximum values (shaded area) showing inter-institutional variability. For definition of harmonized LET, please see section on Simulation of LET.

parameters by 13.9–57.1% (Supplement Table A2). Absolute LET differences increased from proximal dose build-up and target to distal dose fall-off region for single-field SOBP (and perpendicular fields) with inter-institutional differences in arithmetic mean of 1.0, 1.6, 2.8 keV/μm (and 1.5, 1.7, 4.2 keV/μm), respectively. Absolute differences in mean LET for opposing fields were 1.8 keV/μm and 4.8 keV/μm in the target and the proximal dose-build up region, respectively.

Applying the harmonized LET_d to derive D_{RBE} reduced inter-center variations in D_{RBE} substantially. Compared to

using non-harmonized LET, the variation decreased in the proximal, target and distal volume by up to 6.1pp, 5.5pp and 4.6pp, respectively (Figure 3). In the target volume, the inter-institutional variability in harmonized mean (near-min, near-max) D_{RBE} fell below 1.7% (2.9%, 3.3%). $\gamma_{3,3}$ indices were above 89.2%, except for one single field SOBP dose distribution with a $\gamma_{3,3}$ pass rate of 85.9%. Harmonized LET_d reporting reduced the inter-institutional LET_d variability (σ_n) by at least 9.0pp and up to 52.8pp resulting generally in a variability below 10% (Figure 3, Supplement Figure A2). Exceptions

were near-max LET_d in the target volume for all beam arrangements with a remaining maximum difference of up to 14.0% and near-min LET_d in the proximal region for opposing fields of 30.3% and 1.64 keV/ μ m (Supplement Table A2).

Using the harmonized LET definition, no inter-center D_{RBE} variation was significantly different from the corresponding variation in $D_{1,1}$ for any of the investigated DVH-parameters, regions or field arrangements. Inter-institutional variability in D_{RBE} volume parameters exceeded that in $D_{1,1}$ by less than 2.0pp in all evaluated regions and field arrangements, except for the near-min in the proximal region of opposing fields which differed by 4.3pp. Thus, the remaining inter-center D_{RBE} variability was driven by the variability in absorbed dose.

Discussion

This multi-centric study presents a current status of LET calculations at European PT institutions. It harmonizes LET reporting among these institutions to enable consistent analysis and reporting of tumor control and side effects after PT in view of a variable biological effect. Harmonizing the reporting of LET reduced the LET and D_{RBE} variability among the centers considerably. The observed inter-center variability in D_{RBE} using harmonized LET was comparable to that of the underlying absorbed dose. In other words, D_{RBE} and $D_{1,1}$ can be obtained with equivalent precision.

Independent mono-centric studies showed a spatial correlation of radiation-induced injury with elevated LET in brain tumor, breast tumor and chest-wall patients after PT [2–4,6,7,20]. However, and in contrast to absorbed dose and therefore $D_{1,1}$, these follow-up studies reported inconsistently on LET: they differ particularly in averaging method and secondary particle spectra. Additionally, a recent review observed highly inconsistent LET reporting in 354 studies quantifying RBE [17]. Such diversity in LET reporting is in line with the findings in the first part of this study in which the participating institutions initially chose to report LET independently. The current inconsistent LET reporting complicates the inter-center transferability and comparison of clinically derived LET-driven variable RBE models and poses the need for a standardized reporting of LET in the clinics.

The inter-institutional variability in D_{RBE} was primarily reduced by harmonization of LET averaging technique and secondary particle spectrum. The remaining increase of about 1.0pp in inter-center variability from using a constant RBE of 1.1 to harmonized D_{RBE} calculations appears remarkably low, given that different beam models, planning systems, LET simulation environments, scoring techniques and individually optimized treatment plans were used among the institutions. In the target volume, the variability of harmonized mean D_{RBE} between institutions remained below 1.6% and $\gamma_{3,3}$ pass rates generally exceeded 90% for high D_{RBE} regions (>50 Gy(RBE)). These findings compare with the recently postulated requirement before using LET_d for RBE weighted dose calculations [8]. It suggests that LET_d calculation accuracy should impact the average D_{RBE} in the target

volume by less than 1.0% against mono-centric validation measurements. The observed high inter-institutional agreement in harmonized D_{RBE} suggest the conceptual feasibility of multi-centric studies to derive clinical tumor RBE data with increased total patient numbers.

This study confirms that many PT institutions apply their own set of simulation tools, parameters and LET definitions complicating inter-institutional LET comparisons [16]. The potential impact of MC implementation parameters on dose- and track-averaged LET calculations was investigated in monocentric studies earlier [11–15]. This study found that the observed influence of institution-specific simulation software, simulation settings, and beam model on LET variability was relatively small if the same treatment planning situation was planned by multiple PT institutions. Standardization of simulation protocols by specifying step length, range cut and scoring technique in MC simulations, as recently suggested [16], may further reduce differences in harmonized LET_d and thus D_{RBE} calculations. On the other hand, consistent reporting of LET by harmonizing averaging technique and secondary particle spectrum – both are typically easily available in LET simulations – resulted already in substantially increased inter-center LET comparability. Therefore, an adaptation of the suggested harmonized LET_d calculations and reporting by other PT institutions appears feasible and could be the starting point for designing quality control that will be needed for clinical LET calculations and reporting in PT. It may also foster consistent reporting for experiments and modeling of RBE.

This study proposes to report the unrestricted dose-averaged LET for all protons to water or unit density as a measure for radiation quality in PT and to allow for inter-center comparisons of LET. This definition supports unambiguous LET reporting and coincides with the averaging technique, secondary particles and scoring medium most commonly specified in radiation biology experiments in PT [17]. LET_d is thought to reflect the LET-RBE relationship better than track-averaging [11,39,40] and is used as input parameter in several *in-vitro* data-based variable proton RBE models [41]. However, there is an active debate on which particles to include in LET_d scoring in PT [14,15,39] and the biological relevance of heavier secondaries on proton RBE remains to be quantified more accurately [17]. Importantly, the LET_d -RBE relationship depends on ion type [42]. Therefore, we suggest to report LET_d for protons only (all generations) to avoid mixing of different ion types and since protons also contribute most to the total dose (thus biological damage) in PT [14]. Including heavier secondary particles (e.g., helium) in LET_d simulations also slows down MC simulation convergence. Reporting LET_d to water or to unit density tissue, which were sufficiently similar in our study (Supplement Figure A1), accounts for the fact that the main biological target, the cell nucleus, is independent of whether it is a bone or soft tissue cell [42]. It is also consistent with reporting dose to water in radiotherapy [43]. LET_d to unit density tissue minimizes local material dependence by multiplying the LET_d to material with the density of water and dividing it by the local density, in accordance with the report of the American Association of

Physicists in Medicine on proton RBE [1] and other studies [42,44,45]. Further endorsement by a broader community (European Particle Therapy Network (EPTN), Particle Therapy Co-Operative Group, International Commission on Radiation Units and Measurements) would support the proposed harmonized reporting.

A recent systematic review concluded that the current RBE data basis is insufficient to identify the 'correct' LET for PT [17]. Additionally, model parameters for several phenomenological RBE models were fitted to *in-vitro* data with various inconsistent LET definitions. This further complicates the direct application of many available *in vitro*-based RBE models for patient cases. To overcome this limitation and to allow for an application in patient treatment, it is recommended to update the current parameters of empirical models based on a consistent analysis of patient instead of pre-clinical response data – as recently requested by the EPTN [18]. In the current situation, harmonized LET supports inter-center comparability when used as input parameter for existing phenomenological RBE models and when analyzing the radiation response to dose and LET after PT without changing center-specific procedures in MC frameworks.

This study primarily aimed at harmonizing reporting rather than validating institutional LET_d calculations. Nevertheless, MC engines from RayStation and GEANT4 (as implemented in TOPAS and GATE) were previously benchmarked against independent MC simulations of LET_d as well as measurements of their microdosimetric equivalent mean lineal energy [8,46]. Here, RayStation- and GEANT4-based simulations provided consistent results with one another and other utilized simulation environments in terms of harmonized LET_d . However, the present inter-center LET comparison does not replace the validation of a site-specific implementation of LET_d calculations [8,11].

Six out of eight centers were able to convert their LET simulation data to DICOM format for both non-TPS MC engines and non-clinical research versions of commercially available TPS. Firstly, this enables consistent archiving of both dose and LET_d data for upcoming patient outcome analysis on clinical RBE [18]. Secondly, making LET distributions accessible in a clinical setting further informs clinicians on treatment plan safety in view of a variable RBE [1]. Thirdly, sharing LET in a consistent data format (i.e., DICOM) allows for inter-center comparisons.

This study was limited to an investigation in a homogeneous medium where no critical organs had to be spared to precisely compare the physical quantities that determine to a large extent the radiation-induced DNA damage, i.e., dose and LET. Therefore, it may not fully reflect the treatment planning situation in patients. However, proton range and field arrangement primarily determine the spatial LET distribution [44]. The arithmetic mean in LET in the target volume was 2.8 keV/μm for the studied perpendicular and opposing field arrangements and thereby comparable to those occurring in brain and prostate tumor patients with typically similar field arrangements, respectively [19,20,47–52]. Upcoming multi-centric *in-silico* patient treatment planning studies may complement this water phantom study by comparing LET

calculations in patients and assessing the present status of biological modeling in PT before considering some of the existing variable RBE models [41] in clinical patient treatment.

In this multi-centric study, a harmonization of LET reporting in PT was proposed to overcome the existing inter-center differences in reporting LET with respect to averaging methods and secondary particle spectra. Other center-specific factors such as beam characteristics and calculation settings had a minor impact. Harmonized LET reporting reduces inter-center variability in LET and D_{RBE} to a clinically acceptable level and can be easily adapted by other PT institutions. This allows for consistent analysis and reporting of tumor control and side effects after PT in view of a variable RBE. In this way, harmonizing LET reporting contributes to a more rapid and reliable implementation of variable RBE in proton therapy and may help to exploit the full potential of proton beam therapy.

Disclosure statement

JÖ is employed as a Researcher at RaySearch Laboratories. The other authors report no conflict of interest.

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