Magnetic resonance imaging (MRI) and fundus image fusion overcomes some of the limitations of ophthalmological MRI for volume definition in OPT. MRI and fundus image fusion was investigated.

Materials and methods: Eighteen non-consecutive uveal melanoma (UM) patients, who consented for an MRI and had their tumour base visible on panoramic fundus photography, were included in this comparative analysis. Through generating digitally-reconstructed projections from MRI images using the Lambert azimuthal equal-area projection, 2D-3D image fusion between fundus photography and an eye model delineated on MRI scans was achieved and allowed for a novel definition of the target base (MRI + FCTV). MRI + FCTV was compared with MRI-only delineation (MRI GTV) and the conventional (EyePlan) target definition (EPCTV).

Results: The combined use of fundus photography and MRI to define tumour volumes reduced the average discrepancies by almost 65% with respect to the MRI only tumour definitions when comparing with the conventionally planned EPCTV. With the proposed method, shallow sub-retinal tumour infiltration, otherwise invisible on MRI, can be included in the target volume definition. Moreover, a novel definition of the fovea location improves the accuracy and personalisation of the 3D eye model.

Conclusion: MRI and fundus image fusion overcomes some of the limitations of ophthalmological MRI for tumour volume definition in OPT. This novel eye tumour modelling method might improve treatment planning personalisation, allowing to better anticipate which patients could benefit from prophylactic treatment protocols for radiation induced maculopathy.
Tomography, which provide a much higher resolution than CT and MRI, even if they only cover a limited portion of the eye [17,18].

Currently, panoramic fundus photography is the diagnostic imaging modality of choice. Unfortunately, the limited accuracy of the EyePlan geometrical eye model restricts its use to qualitative evaluations. While EYEPLAN allows for the registration of fundus images for validation purposes, it is seldomly used to define the clinical tumour volume [19], let alone to specify the location of structures at risk of radiation damage such as the optic disc or fovea [20,21]. Thus, the volumetric information provided by MRI specifically could complement the description of the tumour shape and volume [13,12,14] as well as improve the accuracy when localizing the macula and the optic nerve. However, delineation of the gross tumour volume using MRI imaging alone is not sufficiently accurate, due to its limited spatial accuracy, e.g. hindering the identification of shallow tumour infiltrations below the retinal surface [14].

In this study we present a multi-modality ophthalmological imaging approach for improved ocular biometry in Proton Therapy. Based on the proposed method, ocular features not directly discernible on 1.5T MRI scans, but appreciable on panoramic fundus photography such as the fovea and shallow sub-retinal tumour infiltration, can be integrated with an MRI-based eye model. This approach aims to overcome the limitation of ophthalmological MRI scans, while improving patient-specificity in definition of the fovea, with the goal of achieving a non-invasive, robust and accurate description of the eye anatomy and pathology for Ocular Proton Therapy.

Materials and methods

Patient dataset

Between 2017 and 2020, uveal melanoma scheduled for proton therapy at the PSI were proposed to undergo a 1.5T MRI orbital scan (3D volumetric T1-weighted Interpolated Breath-hold Examination-VIBE, 0.5 mm isotropic resolution, see [14]) following ethical approval (EKNZ 2014-217 and EKNZ 2019-01987). Thirty-seven, non-consecutive UM patients consented and as a consequence their fundus images, acquired with PANORET-1000 (Medi- bell Medical Vision Technologies, Haifa, Israel), were assessed. The Panoret camera is a trans-pupillary, hand-held digital imaging system using corneal contact lens and trans-scleral illumination. It features a 100° field-of-view and produces comprehensive colour images in the RGB spectrum reflected by the fundus [22].

Amongst the thirty-seven include patients, four (11%) presented lesions hardly visible either on fundus photography or MRI scans due to their anterior location (3 patients) of limited height (1 patient), respectively. For fifteen patients (41%) fovea and optic disk visibility on fundus photography was compromised by tumour infiltration. The remaining eighteen patients (49%) were included in this study as the tumour base (partial or entire), together with the optic disk and fovea, were visible on their panoramic fundus image. Three out of eighteen (17%) underwent an additional protocol, involving the administration of gadolinium as contrast agent to enhance tumour visibility.

Technique of MRI and Fundus image fusion

The geometrical fusion of fundus images with a three-dimensional model of the eye, derived from 1.5T MRI scans poses two main challenges. (1) A solution to the ocular fundus projection problem, i.e. the act of mapping the curved surface of a 3D spheroid, the retina and choroid, upon the 2D plane of the panoramic fundus photography, and (2) a fusion of this with the MR data. Our solution to these two problems is presented in the following sections.

The ocular fundus projection

Any geometrical transformation used to project a spherical surface onto a bi-dimensional plane introduces some sort of distortion [23]. Similarly, when a trans-pupillary fundus image is taken, the resulting picture will be affected by geometrical distortions associated with the process. Further complications arise from the coupling of the camera optics with the patient’s eye, which can be considered as an additional optical system with its own individual optical properties. In addition, the air-to-cornea interface or the angle and inclination of the sensor at time of image acquisition are, amongst others, additional factors contributing to distortions in fundus images.

To address this issue, an empirical approach has been adopted based on using the Panoret-1000 fundus camera to acquire images of three custom-made spherical phantoms and compare three different projection methods (see Appendix, [29]).

Fusion of fundus images and MRI volumes

The distortions associated with the ocular fundus projection step, together with inherent unknowns of the fundus camera geometry, preclude the application of a rigorous Euclidean transformation for alignment with volumetric MR data. To overcome this, an image-based approach, exploiting intensity information in the MRI scans, has been developed and tested (Fig. 1).

For this, a fundus image (MRI-vF) is first digitally reconstructed from the MRI data by the projection of the scleral surface of the 3D MRI model upon a 2D plane which simulates the position of the fundus camera sensor. An intensity level is assigned to each point of the scleral surface by averaging the values of the five most proximal MRI voxels along a ray pointing at the scleral surface from the eye centre, retrieved by fitting a sphere to the eye globe (Fig. 1A). Then, using cubic interpolation and bi-dimensional Gaussian filtering, a virtual image is created, which can be directly compared to the original fundus image (PAN-F) to perform the fusion.

Ideally, a landmark-based approach for registration should be adopted for such a fusion, in which relevant features visible on both imaging modalities, for example the optic disk and the fovea, would be used to identify the best affine transformation (scale and orientation) for alignment. Due to the limits in resolution however (0.5 mm isotropic voxel size), such small ocular structures are not directly visible on the MRI scan. While the optic disk can be indirectly approximated as the intersection of the optic nerve and the sclera, there are no ancillary structures enabling a plausible definition of the fovea position on MRI. According to the literature, the position of the fovea varies from individual to individual and is defined by the angle (the so-called kappa angle) between the visual axis, where the macula lies, and the pupillary axis, i.e. the axis of eye symmetry [24,25]. Based upon these considerations, a fovea probability region can be defined on the MRI volumes as the intersection between the retinal surface and a cone with its vertex at the lens centre. This region encompasses the pupillary axis and assumes a deliberately overestimated range of variability ±9° (Fig. 1B). Any point belonging to this area is a fovea candidate and can be used in combination with the fixed position of the optic disk to register, on a patient-specific basis, the virtual (MRI-vF) and original (PAN-F) fundus images (Fig. 1C).

Thus, digitally reconstructed fundus images (MRI-vF) were qualitatively compared with actual fundus photographs (PAN-F) for all patients included in the study. A manual selection was performed aiming to have the best overlap of macroscopic part of the lesion on both images while thin lesion extensions were ignored as
not observable in MRI. Then, Normalized Cross Correlation (NCC) was calculated between the chosen MRI-vF and PAN-F images.

Comparative study on tumour volume definition and fovea position using combined MRI and fundus imaging data vs MRI only vs EyePlan

The identification of the virtual fundus photography most similar to the clinical picture leads to the consolidation of a reliable geometrical relationship between the fundus photography and the 3D MRI volume using Equation 1. Based on the fusion of the fundus image and MR, the tumour base delineation on the fundus image is propagated upon the 3D eye model and integrated with the tumour volume identified on the MRI scans to achieve a multi-modality, clinical tumour volume (MRI + FCTV). Similarly, the patient's fovea, as identified on the fundus image, is back-projected on the 3D eye model (Fig. 1D). This was compared against conventional EYEPLAN treatment planning and the consensus guidelines for CT and MR atlas-based delineation in Neuro-Oncology recently proposed by the European Particle Therapy Network (EPTN) [26].
MRI + FCTV was compared with MRI-only delineation (MRIGTV) and conventional target volume definition (EPCTV) based on clips using Volume Ratio (VR), Area Ratio (AR) and tumour-to-clip distances.

Results

The Lambert Azimuthal equal-area projection exhibited the lowest errors and as a result was adopted as the fundus projection technique throughout this study (see Appendix).

Eighteen out of the 37 UM patients (49%) satisfied the requirements of feature visibility in their fundus image and were therefore included in this analysis. Their EPCTV volumes and tumour heights ranged from 84 to 2647 mm³ and 2.5 to 7.1 mm, respectively. The identification of the MRI-vF best resembling the PAN-F was achieved for all patients with an average NCC coefficient of 0.47 (±0.07). However, the process was found to be particularly challenging for shallow tumours (tumour height < 3.0 mm). A significant correlation between high similarity of MRI-vF and PAN-F after registration, quantified using NCC, and tumour height was found (Pearson’s rho coefficient: 0.80, p-value <0.005).

The results of the comparison of tumour volumes defined using the proposed method, compared to those defined in EYEPLAN (EPCTV), are reported in Table 1.

When comparing the per-operative measurements of clip-to-tumour distances, the combined use of fundus photography and MRI to define tumour volumes reduced the average discrepancies by almost 65% with respect to the MR only tumour definitions (0.66 mm ± 1.80 mm and 1.80 mm ± 1.47 mm on average for MRI + FCTV and MRIGTV, respectively). Fig. 2 depicts the root mean square of clips discrepancies for MRI + FCTV and MRIGTV for all patients included in the dataset.

As seen in Fig. 2, P7 and P8 stands out as the two cases with the highest discrepancy. Here, the combination of fundus and MRI images clearly identified shallow sub-retinal infiltrations of the

Table 1

Discrepancies in Tumor Volume Definition for ocular Proton Therapy. A gross target volume defined solely on MRI scans (MRIGTV) and a clinical target volume defined using MRI in combination with Fundus photography using the proposed method (MRI + FCTV) are compared with clips-based definition of the tumor extension using the treatment planning system EyePlan (EPCTV). Also, the discrepancy in the fovea location determined using MRI in combination with Fundus and defined in the EyePlan model along with its distance to the Optic Disk are reported.

<table>
<thead>
<tr>
<th>Patient</th>
<th>Height [mm]</th>
<th>Volume Ratio</th>
<th>Area Ratio</th>
<th>Fovea Location</th>
</tr>
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<tbody>
<tr>
<td></td>
<td>MRI+ F vs EP [mm]</td>
<td>MRIGTV/EPCTV</td>
<td>MRI + FCTV/EPCTV</td>
<td>MRI + F OD-Fovea distance [mm]</td>
</tr>
<tr>
<td>P1</td>
<td>3.88</td>
<td>0.47</td>
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<td>0.55</td>
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<tr>
<td>P2</td>
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<tr>
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<tr>
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<td>0.73</td>
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<tr>
<td>Std.Dev</td>
<td>1.83</td>
<td>0.25</td>
<td>0.26</td>
<td>0.25</td>
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</table>

Fig. 2. Room Mean Square of clips-to-tumour distances discrepancies between measurement performed at time of surgery and the tumour volume definition, based on MRI-only delineation (y-axis) and based on MRI and Fundus image fusion (x-axis) for the eighteen patients included in the study. Dotted line represent the linear fit of all data. The shaded grey area corresponds to the interval defined by the linear fit plus/minus the standard deviation of the discrepancies.

*16% ± 12% *27% ± 26%
tumour which were otherwise invisible on the MRI images alone (see Fig. 3).

For 16 out of 18 (89%) of the cases, the fovea position, as determined from fundus image fusion, was inside the area defined by the EPTN guidelines. In comparison, for the conventional EyePlan definition, the fovea was outside of this same region in 44% (8/18) of the considered cases.

Fig. 4 shows two exemplary cases (P4 and P11, see Table 1) for which the difference in fovea location between the two eye models (EP and MRI + F) is above 2 mm and therefore fundus registration...
using EyePlan leads to inaccurate projections, which might be mistaken for target volume definition misses or overestimations during clip surgery.

**Discussion**

The aim of this study was to develop and test an image-based approach to the integration and depiction of the retina and choroid, as captured by panoramic fundus photography, to an MRI-based anatomically accurate three-dimensional model of the eye.

An important first step towards this goal was to adopt the Lambert Azimuthal Equal-Area projection to model the distortion introduced by the geometry of fundus imaging (see Appendix). While a complete description of the optical system of the fundus camera at the time of acquisition might be theoretically more accurate, it is rather unfeasible in practice due to the number of inherent uncertainties associated with the panoramic fundus photography. As such, the adoption of a purely empirical approach to the problem, through the analysis of experimental data acquired with the same machine used on patients, allowed us to determine the best projection model and quantify the associated errors. These have been found, on average, to be within a clinically acceptable 0.5 mm. Second, instead of relying on the conventional predefined anatomical definition of the macula and optic disk of EyePlan [16,19], an image-based approach, fully exploiting the intensity level information offered by MRI scans, has been developed. A direct comparison, both qualitative and quantitative, between fundus images acquired on the patient, and a corresponding picture digitally reconstructed from MRI, allows to define the relative geometry between the MRI eye model and the fundus photography, thus enabling us to integrate the tumour base and fovea position from fundus images with the MRI 3D eye model. As a result, a clinical tumour volume based exclusively on MRI and fundus image information can be generated.

With respect to the gross tumour volume delineated on MRI scans only, MRI + FCTV is more similar to the EyePlan target definition. More importantly, sub-millimetric discrepancies with tumour-to-clip distances measured at time of implantation, the only quantitative available data involved in the conventional definition of the target base, showed, for MRI + FCTV, an improvement of almost 65% with respect to MRI+CTV. As shown in Fig. 3, two patients in the considered dataset presented a sub-retinal tumour infiltration. Due to careful placement of the clips such that they encompassed the zone of flat choroidal infiltration, the full tumour volume could be included in the EyePlan model. These infiltrations were not visible on the available MRI scans. However, when applying the presented non-invasive multi-modality image-based method however, the definition of the tumour base, as delineated on the fundus images, could be fully integrated to the MRI, thus also achieving a complete coverage of the lesion.

Another advantage associated with this MRI 3D eye model is the more accurate anatomical localisation of the fovea position with respect to the generic geometrical eye model, as evidenced by the comparison with the EPTN guidelines and the cases in Fig. 4. In addition to doubts about the correctness of surgical clip positioning, the accuracy of the fovea location can have consequences for treatment planning, when choosing the eye position depends on the projected radiation exposure to sensitive structures such as the fovea, whose irradiation is a negative predictive factor for long-term vision [20,21]. Also, recent prophylactic treatment protocols, consisting of 2–4 monthly intravitreal anti-VEGFs (anti-vascular endothelial growth factors) injections have been proven successful in preventing irreversible loss of vision in those patients where the macula had been irradiated [27]. And identifying those patients who might benefit from such intensive follow-up and treatment, is currently based on EyePlan and therefore susceptible to inaccuracies.

However, it is important to point out how this alternative eye tumour modelling does not allow to abandon clip surgery, which is not only required for treatment planning but also treatment delivery. Clips guarantees the utmost accuracy in the patient position, verified using radiographic imaging [28], thus avoiding a geographical miss and local recurrence with a significantly increased risk for systemic metastases [7]. Unless this problem is resolved, clip surgery remains indicated to ensure continuing high local tumour control.

A limitation of this study is that the number of patients included in the analysis of the performance was dependent on the visibility of features on the fundus images. Obtaining a panoramic fundus image which contains the macula, optic disk and entire target is not possible for all patients due to the limitation of the field-of-view of the camera (Panoret-1000 features a 100° field-of-view). On the other hand, the creation of a composite fundus image using acquisitions capturing different parts of the retina is common practice in ophthalmology and, even though it would require investigation, we believe that there are no technical reasons that would prevent the application of the proposed methods on such composite images.

Also, the height of the tumour is a limiting factor: it is reasonable to expect, that it would be impossible to generate virtual fundus images of sufficient quality if the tumour height is below 2 mm with the resolution of the presented 1.5T MRI protocol. Even for tumours up to 3 mm of height the use of contrast agent and the absence of motion artefacts in MRI scans become crucial to a successful application of the proposed method. As such, further efforts towards improving MRI imaging quality and automatizing the fusion process are foreseen in the near future. Finally, the supervised selection of the virtual fundus image featuring the highest similarity to the original image is highly reliant on the expertise and judgement of the radiation oncologists and ophthalmologists involved. Clinical target volumes in the field of ophthalmological oncology, particularly when considering the limited size of the volumes involved and the proximity of structures relevant for vision retention, will likely always benefit from close supervision by trained professionals.

**Conclusion**

An alternative method to accurately model the tumour and the eye in Ocular Proton Therapy, based on the combination of MRI and fundus imaging, is presented in this study. Merging the information provided by 3D ophthalmological MRI scans and high-resolution fundus photography allows for the inclusion of the shallowest features of the tumour inside the target volume definition, up to now only possible with the implantation of surgical markers. Moreover, a localization of the fovea position can also be achieved, significantly improving the anatomical accuracy and personalisation of the eye model used for treatment planning. The latter could allow to avoid unnecessary irradiation of the fovea in certain cases, or, when unavoidable, to identify those patients who might benefit from prophylactic anti-VEGFs intravitreal injection treatment protocols, to prevent irreversible vision loss due to radiation induced maculopathy.

**Declaration of Interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.
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Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.radonc.2022.06.021.

References