

Non-invasive Imaging of Cycling Hypoxia in Head & Neck Cancer Using Intrinsic Susceptibility MRI

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Translational relevance: The presence of cycling hypoxia is a key determinant of radio-resistance, impaired drug delivery and increased metastatic potential in head and neck squamous cell carcinoma (HNSCC). Non-invasive imaging strategies to identify and assess the magnitude and distribution of acutely hypoxic tumor cell subpopulations *in situ* may provide prognostic and predictive biomarkers for the treatment of HNSCC. Quantitation of the transverse relaxation rate, R_2^* , using intrinsic susceptibility MRI can be used to serially monitor variations in levels of paramagnetic deoxyhemoglobin, associated with cycling hypoxia, both in HNSCC xenografts and patients on a clinical 3T system. Such fluctuations are predominantly associated with regions of impaired tumor vasculature, the presence of which may be linked to a poorer outcome.

Abstract:

Purpose: To evaluate intrinsic susceptibility (IS) MRI for the identification of cycling hypoxia, and the assessment of its extent and spatial distribution, in head and neck squamous cell carcinoma (HNSCC) xenografts and patients.

Experimental Design: Quantitation of the transverse relaxation rate R_2^* , which is sensitive to paramagnetic deoxyhemoglobin, using serial IS-MRI acquisitions, was used to monitor temporal oscillations in levels of paramagnetic deoxyhemoglobin in human CAL^R xenografts and patients with HNSCC at 3T. Autocovariance and power spectrum analysis of variations in R_2^* was performed for each imaged voxel, to assess statistical significance

and frequencies of cycling changes in tumor blood oxygenation. Pathological correlates with tumor perfusion (Hoechst 33342), hypoxia (pimonidazole) and vascular density (CD31) were sought in the xenografts, and dynamic contrast enhanced (DCE) MRI was used to assess patient tumor vascularization. The prevalence of fluctuations within patient tumors, DCE parameters and treatment outcome were reported.

Results: Spontaneous R_2^* fluctuations with a median periodicity of 15 minutes were detected in both xenografts and patient tumors. Spatially these fluctuations were predominantly associated with regions of heterogeneous perfusion and hypoxia in the CAL^R xenografts. In patients, R_2^* fluctuations spatially correlated with regions of lymph nodes with low K^{trans} values, typically in the vicinity of necrotic cores.

Conclusion: Intrinsic susceptibility MRI can be used to monitor variations in levels of paramagnetic deoxyhemoglobin, associated with cycling hypoxia. The presence of such fluctuations may be linked with impaired tumor vasculature, the presence of which may impact treatment outcome.

Introduction

Understanding the tumor microenvironment is essential for the delivery of personalized cancer treatment (1-3). Hypoxia, resulting from an imbalance between oxygen delivery and consumption, is an important component of the tumor microenvironment that influences the response to both radiotherapy and chemotherapy (2, 4, 5). Tumor hypoxia is a well-established cause of treatment resistance, and adversely affects the prognosis of head and neck squamous cell carcinoma (HNSCC) (6). Furthermore, targeting tumor hypoxia has been validated as a therapeutic strategy in HNSCC (6, 7), and its modification during standard radiotherapy can improve outcomes in terms of loco-regional control, disease-specific survival and overall survival (8).

Historically, the low oxygen tension associated with tumors was considered to be a consequence of chronic or diffusion-limited hypoxia (9), and acute or perfusion-limited hypoxia (10). It is now clear that this is an oversimplification, and that the tumor microenvironment is highly dynamic and contains subpopulations of cancer cells exposed to continuously changing gradients of oxygen, nutrients and pH (11). These microenvironmental components can promote genomic instability within cancer cells, providing an overall selective advantage for malignant growth (12). For example, tumors may contain cells that have been differentially exposed to hypoxia for minutes to hours and then re-oxygenated (13-15). This process can recur, leading to 'cycling' hypoxia (16-18). Cycling hypoxia arises from variations in red blood cell (RBC) flux through the abnormal tumor vasculature (16, 18, 19). Several factors may

contribute to such fluctuations, including arteriolar vasomotion (20, 21), rapid vascular modeling (22), disorganized vascular hierarchy (23, 24) or increased transcapillary permeability (25).

Experimental evidence suggests that hypoxia and anoxia can alter tumor cell cycle checkpoint control and the sensing and repair of DNA damage (12, 26, 27). Pre-clinical studies have shown that the homologous recombination DNA repair pathway is suppressed by chronic hypoxia, whereas DNA damage-associated checkpoint cell cycle arrest and non-homologous end joining are stimulated by acute hypoxia (12, 27). These factors lead to radio-resistance, decreased delivery of cytotoxics, and increased metastatic potential. Therefore, detecting the magnitude and distribution of acutely and chronically hypoxic tumor cell subpopulations may determine their prognostic and predictive value in HNSCC and help selection of optimal therapeutic strategies (2).

Advances in imaging techniques can now provide a means of defining non-invasive quantitative biomarkers to inform on biologically relevant structure-function relationships in tumors, enabling their accurate detection, an understanding of their behavior, and report on response to treatment. One such approach, intrinsic susceptibility MRI (IS-MRI), involves quantitation of the transverse relaxation rate R_2^* , which is sensitive to the concentration of paramagnetic deoxyhemoglobin within the vascular compartment of tissues. Compared to most normal tissues, tumors typically exhibit relatively fast R_2^* values, a consequence of the high concentration of deoxygenated RBCs

within the typically chaotic and unstable microcirculation. However, the strength of the correlation between tissue R_2^* and oxygen partial pressure, measured *in situ* using oxygen probes, or via immunohistochemical detection of reduced 2-nitroimidazole adducts, has been reported to be at best moderate (28). This is likely due to the dependence of R_2^* on a number of physiological factors, including blood volume, hematocrit and vessel calibre (28-30). However, variations in these parameters can be greatly compensated for, and data interpretation simplified, through assessing modulation of R_2^* with, for example, hyperoxic gas challenge, or injection of vascular contrast agents. It is also possible to temporally monitor changes in R_2^* using continuous IS-MRI measurements, which have been exploited pre-clinically to non-invasively image cycling hypoxia at high spatial and temporal resolution in tumors propagated in mice (31-33).

In this study, IS-MRI was initially used to measure spontaneous R_2^* fluctuations in mice bearing HNSCC xenografts on a clinical 3T MRI scanner, and pathological correlates sought. Subsequently, the preclinical IS-MRI methodology was translated to a clinical pilot study of patients with locally advanced HNSCC, also imaged at 3T.

Materials and Methods

Pre-clinical Imaging:

Experiments were performed in compliance with Home Office licenses issued

under the UK Animals (Scientific Procedures) Act 1986 following local ethical approval, the United Kingdom National Cancer Research Institute guidelines for animal welfare in cancer research (34) and with the ARRIVE guidelines (35). Adult female athymic NCr nu/nu mice (n = 5, 7-8 weeks old, Charles River) were injected subcutaneously on the flank with 5×10^5 human CAL^R HNSCC cells, stably resistant to EGFR tyrosine kinase inhibitors. The CAL^R xenograft doubling time *in vivo* is approximately 4 days (36). Tumor volume was monitored using calipers and the formula for an ellipsoid, $(\pi/6) \times L \times W \times D$, where L, W and D are the largest orthogonal dimensions of the ellipsoid. Tumors were imaged at volumes of $\sim 500 \text{ mm}^3$.

MRI was performed on a 3T clinical scanner (Philips Achieva, Philips Medical Systems, Best, Netherlands) using a dedicated pre-clinical asymmetric high-resolution three element receive coil ("Mouse Hotel", Philips), enabling simultaneous measurements of up to three animals. Mice were anesthetized with a 10 ml/kg intraperitoneal injection of fentanyl citrate (0.315 mg/mL) plus fluanisone (10 mg/mL) (Hypnorm; Janssen Pharmaceutical Ltd, High Wycombe, UK), midazolam (5 mg/mL) (Hypnovel; Roche, Welwyn Garden City, UK), and water (1:1:2). Anesthetized mice (two per scanning session) were positioned with tumors immobilized at the center of the coil elements (Supplementary materials, Figure S1). Mouse core body temperature was maintained by a built-in heating system within the coil. A round-end cylinder phantom containing 1.5 mM gadoterate meglumine (Dotarem, Guerbet, Villepinte, France) in saline was positioned in the third coil element and used to monitor MR system stability (Supplementary materials, Figure S1).

Anatomical coronal and axial T₂-weighted images were first obtained to localize the tumor. A 2D gradient echo sequence with 6 echo times (temporal resolution: 30s, FA = 24°, TE = 4.92 to 29.52 ms in increments of 4.92 ms, TR = 250 ms, FOV = 200 x 200 mm², 3 slices, voxel size: 0.3 x 0.3 x 1.5 mm³) was then used to scan continuously over 50 minutes, providing 100 time points. The total scanning time was 65 min.

Pathological Assessment of Tumor Perfusion, Vascularization and Hypoxia:

The hypoxia marker pimonidazole (60 mg/kg, Hypoxyprobe, Burlington, MA) was administered i.p. to mice bearing CAL^R xenografts 1 hour before the MRI scan, to allow for maximal bio-reduction in hypoxic tumor regions. Following MRI, Hoechst 33342 (15 mg/kg; Sigma-Aldrich, Poole, UK), a marker of perfused vessels, was injected via a lateral tail vein (37, 38). After 1 minute, tumors were rapidly excised and flash-frozen over liquid nitrogen. Fluorescence signals from Hoechst 33342 and reduced pimonidazole adducts bound with mouse monoclonal FITC-conjugated antibodies were detected on whole tumor 10µm thick frozen sections, cut in the same plane as for the MRI, using a motorized scanning stage (Prior Scientific Instruments, Cambridge, UK) attached to a BX51 microscope (Olympus Optical, London, UK), driven by image analysis software (CellP, Soft Imaging System, Münster, Germany) as previously described (38). Vessel density was then assessed through detection of CD31 on the same sections using rat anti-mouse CD31 antibodies (BD Biosciences, Oxford, UK, 1:100) and Alexa 546-conjugated goat anti-rat IgG antibody (Invitrogen, 1:500). Tumor hypoxia, perfusion and

vessel density were quantified as previously described (38).

Clinical Imaging:

Ten patients with untreated, histologically proven HNSCC were scanned twice (24-168 hours apart) prior to initiation of treatment. Written informed consent was obtained from all patients, which was approved by the Institutional Research Review Board (CCR 3970) and the NHS Research Ethics Committee (REC number 13/LO/0628). MRI was performed at 3T (MAGNETOM Skyra, Siemens Healthcare, Erlangen, Germany) using a 20 channel head and neck coil. Patients were aligned in a supine position with slight neck extension using a standard headrest and lateral cushions for improved stabilization. Anatomical coronal and axial T₂-weighted images were first acquired to assess the extent of the disease and aid planning of functional imaging. Subsequently, a 2D gradient echo sequence with 6 echo times (temporal resolution: 30s, FA = 24°, TE = 4.92 to 29.52 ms in increments of 4.92 ms, TR = 250 ms, FOV = 240 x 240 mm², 3 slices, voxel size: 0.9 x 0.9 x 2.5 mm³) was used to scan continuously for 1 hour (120 time points). Finally, DCE MRI was performed using an axial 3D FFE sequence (FA=3/18°, TE/TR=2.46/4.56 ms, FOV = 256 x 198 mm², 24 slices, 1.5 x 1.5 x 2.5 mm³ voxel, temporal resolution: 2.9 s) during which 0.2 mg/kg gadoterate meglumine was injected as a bolus. The total scanning time was 75 min. A blood sample was taken for a full blood count prior to each MRI scan to determine the hematocrit.

Signal processing:

R_2^* maps were calculated for each time point using MatLab (MathWorks, Natick, MA), and the gradient echo image signal intensity decay was fitted on a voxel-wise basis to a mono-exponential model using a least-squares fit method (30). A non-rigid image registration (MIRT - Medical Image Registration Toolbox for Matlab, sum-of-squared-differences similarity measure (39)) was performed to correct for any motion in the clinical examinations. The shortest echo time (TE = 4.6 ms) images were used to calculate deformation matrices, which were subsequently applied to corresponding R_2^* maps ($R_2^*(t)_{\text{MOCO}}$). The residual motion was inspected using cine loops and image intensity time traces $S(t)_{\text{MOCO}}$ generated for each tumor volume of interest (50 mm line profiles in two orthogonal directions).

Corrected time series were analyzed for all volumes of interest (VOI) voxels to test for the presence of non-random fluctuations, using a power spectrum analysis. The following processing steps, previously described by Baudelet *et al* (31, 40), were performed: i) linear trend subtraction, ii) calculation of autocovariance functions, iii) calculation of power spectral density, iv) chi-square test of power coefficients to test if fluctuations were different from the Gaussian noise. No data filtering or windowing was used. Coefficients in the frequency range of 0 - 0.005 Hz, characteristic for cycling hypoxia (14, 17, 20, 31, 33), were considered significant. Higher frequency noise dominated coefficients were not included in the analysis. Significant non-Gaussian R_2^* fluctuations (one or more coefficient above $P = 0.05$ significance threshold)

were spatially mapped using binary maps (Figure 1). The total numbers of fluctuating voxels and percentage of fluctuating voxels in the imaged volume (fluctuating volume percentage) were determined for each VOI.

DCE MRI was used to non-invasively investigate the vascularization of the patient tumors. Pharmacokinetic modeling was performed using MRIW (41) software and the extended Kety model (42) and a population-based arterial input function (43). The volume transfer constant between blood plasma and extracellular extravascular space, K^{trans} (min^{-1}), and enhancing fractions, EF, were calculated for each voxel (41).

Volumes of interest from each CAL^R xenograft were manually delineated using in-house software developed in MatLab. Patient VOIs, including primary and nodal tumor sites, were manually delineated using the Pinnacle3 (Philips Healthcare, Best, Netherlands) treatment planning system (TPS). Voxel-matched parameter maps were generated and exported using the TPS with 1 x 1 x 2.5 mm voxel resolution. This allowed for spatial investigation of perfusion and permeability in fluctuating and non-fluctuating tumor regions. Mean values of R_2^* and K^{trans} were calculated for enhancing regions of tumors and compared with fluctuating and non-fluctuating sub-volumes. Correlations between whole tumor median K^{trans} , R_2^* VOI values and fluctuating volume percentage were also tested.

Treatment and outcomes in the clinical cohort:

All patients received radical radiotherapy with concomitant chemotherapy (cisplatin 100 mg/m² or carboplatin, AUC5, day 1 and 29) according to institutional protocols. Macroscopic and microscopic disease received 65 Gy or 54 Gy in 30 fractions, respectively, using intensity-modulated radiotherapy (IMRT) with a simultaneous integrated boost. Macroscopic disease was defined as the gross tumor identifiable on pre-treatment images and clinical examination whereas microscopic disease included nodal areas at risk of harboring microscopic disease dependent on the site of the primary tumor. Patients with evidence of persistent, progressive or relapsed disease, arising within 12 months of completion of treatment, were classed as non-responders. The analysis of the clinical MRI data was blinded to the treatment outcome.

Statistical analysis:

The Shapiro-Wilk test was used to evaluate distribution normality of measured parameters. The chi-square test of power coefficients (frequency range: 0-0.005 Hz) was used to assess if the fluctuations were different from the Gaussian noise. The paired t-test was used to compare the mean values of R_2^* , K^{trans} (responders vs. non-responders, primary vs. lymph nodal tumors) and fluctuating volume percentage (responders vs. non-responders, fluctuating volume percentage in MR1 vs. MR2). Kendall's tau (τ) was used to test for correlation between the mean fluctuating volume percentage, R_2^* and vascular/hypoxia parameters (Hoechst 33342, pimonidazole adduct fractions, K^{trans}). A P value of 0.05 was chosen as the criterion for statistical significance

in all tests and adjusted to account for multiple correlation comparisons. Statistical analysis was performed using the Matlab Statistics Toolbox.

Results

Pre-clinical findings:

The spatial distribution and volume percentage of spontaneous R_2^ fluctuations*

The range of CAL^R tumor volumes measured using T₂-weighted images was 0.48 – 0.94 cm³ with a median of 0.59 cm³. The median baseline R_2^* for the CAL^R xenografts was 32 s⁻¹ (range: 26 – 50 s⁻¹) with elevated values commonly found at the periphery of tumors (Figure 1A). Significant spontaneous R_2^* spatial variations were detected in all the CAL^R xenografts (n = 5), with an average fluctuating volume percentage of 8% (Table 1). Figure 2B illustrates the spatial distribution of fluctuations in the xenograft cohort. Examples of power spectra measured for representative voxels in fluctuating and non-fluctuating regions of CAL^R xenografts, and adjacent muscle, are shown in Supplementary material, Figure S2.

Perfusion and hypoxia in fluctuating sub-regions of CAL^R xenografts

Composite images showing the distribution of Hoechst 33342, pimonidazole

adducts and CD31 for each CAL^R xenograft are shown in Figure 2C. Perfused vasculature was predominantly associated with the tumor periphery, with more hypoxic and/or avascular regions towards the core. The mean values of perfused and hypoxic fractions were 10.4% (range: 5.1 – 14.2) and 7% (range: 6.5 – 20.9) respectively.

There was a negative trend ($\tau = - 0.8$, $P = 0.08$, Supplementary materials, Figure S3) between median fluctuating and perfused tumor fractions. There was no correlation between median fluctuating volume percentage and chronic hypoxia, identified with pimonidazole staining ($\tau = - 0.2$, $P = 0.817$). Significant R_2^* fluctuations were apparent in regions of the tumor with a heterogeneous distribution of hypoxic and perfused parts although absent in well-perfused areas (Figure 2B). There was no correlation between baseline R_2^* and pimonidazole or Hoechst 33342 staining ($\tau = 0.1$, $P = 1$ and $\tau = 0.01$, $P = 1$ respectively, Supplementary materials, Figure S3).

Clinical findings:

The spatial distribution and volume percentage of spontaneous R_2^ fluctuations*

A total of 7 primary sites and 11 lymph nodes were imaged and outlined for the purpose of the study. Patient and treatment characteristics are summarized in Table 2. The range of measured Hct was 0.283–0.459 and the mean value was 0.4. Images revealed high spatial heterogeneity in metastatic

lymph nodes (Figure 3). The median baseline R_2^* was 43 s^{-1} (range: $35 - 56 \text{ s}^{-1}$) for lymph nodes and 54 s^{-1} (range: $47 - 56 \text{ s}^{-1}$) for primary tumors, which differed significantly ($P < 0.01$). Elevated R_2^* values were commonly found at the periphery of lymph nodes (Figure 4A). Primary sites were significantly affected by patient motion, while lymph nodes were fairly stationary (Supplementary materials, Figure S4). Three primary tumors were excluded from the analysis due to excessive motion that could not be compensated for. Significant R_2^* fluctuations were detected in 4 primary sites and 10 lymph nodes in 9/10 patients, with the fluctuating volume percentage varying between 0 and 23% (Table 2). Examples of nodal VOI fluctuation maps obtained in two MRI sessions (48 hours apart) are shown in Figure 4. Examples of power spectra measured for representative voxels in fluctuating and non-fluctuating parts of human HNSCC tumors, and adjacent muscle, are shown in Supplementary material, Figure S5.

Mean values of fluctuating volume percentage measured in the two MRI visits did not differ statistically ($P = 0.12$).

The distribution of fluctuating volume percentage in the patient cohort was positively skewed and not normal ($P < 0.01$). Most of the observed significant frequencies were in the low-frequency range $< 0.003 \text{ Hz}$ ($< 1 \text{ cycle} / 5.5 \text{ min}$) with a median frequency of 0.0011 Hz ($1 \text{ cycle} / 15 \text{ min}$).

K^{trans} and R_2^ in fluctuating and not fluctuating parts of patient tumors*

The median K^{trans} values calculated for patient primary and nodal tumors were 0.127 and 0.182 min^{-1} respectively. A rim-enhancing pattern, with no or low

contrast uptake in the center, was observed in 7/11 nodes. The mean nodal enhancing fraction was 0.86. There was no difference in enhancing fraction values between fluctuating and non-fluctuating parts of nodal tumors ($P = 0.84$). Examples of fluctuation maps with corresponding K^{trans} maps are shown in Figures 3 and 4. Non-random fluctuations were detected in areas of lymph nodes with low K^{trans} values (Figure 3 IV, Figure 4), often in the vicinity, but not in the center, of cystic or necrotic nodes (Figure 3 II). Mean K^{trans} values were lower in the fluctuating regions of nodal tumors ($P < 0.01$) and baseline R_2^* values did not differ ($P = 0.97$). There was no correlation between mean K^{trans} or R_2^* and fluctuating volume percentage ($\tau = -0.09$, $P = 0.75$ and $\tau = 0.06$, $P = 0.87$ respectively) in the lymph nodes (representative K^{trans} and R_2^* distributions for fluctuating and non-fluctuating human HNSCC tumor regions are shown in Supplementary material, Figure S6).

Treatment outcomes

Clinical outcomes are presented in Table 2. Six out of 10 patients were classified as responders whilst three patients developed progressive or residual disease 3 months post-completion of the treatment (Pt 3, 5, 7). One patient had loco-regional disease relapse 9 months post-completion of the treatment (Pt 5). The mean lymph nodes fluctuating volume percentage, averaged for both visits, was 8% (range: 2 – 15%) in non-responders and 3% (range: 0 – 6%) in responders (Supplementary materials, Figure S7). The difference was borderline insignificant ($P = 0.051$). There was insufficient data for the primary tumor analysis. There was no difference in mean tumor K^{trans}

($P_{\text{primary}} = 0.19$, $P_{\text{nodes}} = 0.96$) or R_2^* ($P_{\text{primary}} = 0.29$, $P_{\text{nodes}} = 0.81$) values between responders and non-responders.

Discussion

In this study we describe the successful implementation of IS-MRI for non-invasive imaging of cycling oxygenation changes in HNSCC, using a clinical 3T MRI scanner. Following promising results from the pre-clinical phase, the methodology was translated to a clinical study. To the best of our knowledge, our study is the first application of serial IS-MRI methodology to detect cycling hypoxia in a clinical setting.

Measurements of cycling hypoxia using serial IS-MRI was first introduced in a pre-clinical study of murine fibrosarcoma performed at 4.7T by Baudelet *et al* (31, 40). In our study spontaneous R_2^* fluctuations, reflecting varying blood flow and levels of oxygenation/hypoxia, were detected in both CAL^R xenografts and patients with HNSCC. Pre-clinically, the cycling variations were apparent in mixed perfused and hypoxic regions of the tumor, confirmed histologically using Hoechst 33342 uptake and pimonidazole adduct formation. In the patients, R_2^* fluctuations were observed within areas of lymph nodes exhibiting low K^{trans} values, often in the vicinity, but not in the center, of necrotic nodes. It has previously been shown, that K^{trans} values correlate with the level of perfusion (42). We observed lower K^{trans} values in fluctuating parts of metastatic lymph nodes, which suggest that fluctuating

blood oxygen levels are caused by an insufficient or intermittent blood delivery as a result of aberrant vasculature. This observation aligns with another pre-clinical study in which ~80% of the fluctuations were found to occur in tumor regions with immature vessels (44). This may underpin the negative trend observed between fluctuating R_2^* and perfused fraction in the CAL^R xenografts, and the negligible level of fluctuations detected within chronically hypoxic and avascular tumor areas identified by pimonidazole adduct formation and DCE MRI, respectively. The lack of correlation between pimonidazole, K^{trans} and fluctuating volume percentage also indicates that regions exhibiting intermittent blood flow and cycling hypoxia cannot be detected using single contrast agent injection methods. The bio-reduction of pimonidazole is averaged in time post-injection and therefore not sensitive to acute changes of hypoxia. DCE data are acquired typically over a much shorter period of time (<10 min) and pharmacokinetic modeling assumes constant rates of perfusion and permeability in the assessed vasculature. Serial IS-MRI can be acquired over a longer period of time, revealing the presence of oxygen level fluctuations at frequencies characteristic of cycling hypoxia.

Frequencies in the range of 0.00027 – 0.001 Hz (15 – 60 min) have been reported in preclinical measurements of cycling hypoxia (14, 17, 20, 31, 33). The median frequency of 0.0011 Hz (1 cycle / 15 min) found in our study is comparable to tumor R_2^* oscillation frequencies reported by Baudalet *et al* and Goncalves *et al* (0.0036 Hz and <0.001 Hz, respectively) (31, 33).

CAL^R xenografts were used in this study as they emulate the high vascular

heterogeneity frequently found in HNSCC tumors in the clinic. It is expected that blood volume is higher in primary HNSCC tumors than metastatic lymph nodes, which for comparable level of tissue oxygenation would result in faster R_2^* rates (more paramagnetic deoxyHb/voxel)(30, 45). Similarly, in the case of severely hypoxic hypovascular tissues, such as those observed in CAL^R tumors, slow values of R_2^* would be predicted. The presence of hypoxic and under-perfused tumor sub-regions, characteristic of CAL^R tumors (37), has also been reported in patients with metastatic HNSCC lymph nodes (46). This is consistent with our findings of abundant regions of impaired perfusion and necrosis identified in both pre-clinical and clinical settings. In our study, the median fluctuating volume percentage, detected in all imaged CAL^R tumors, was 8% (range: 4 – 11%). This was comparable, but did not correlate ($r = -0.2$, $P = 0.817$) with the pimonidazole fraction (7%). The incidence of cyclical hypoxia is more likely in tumor regions where the oxygen saturation of the blood entering that region is relatively low, resulting in a complex dynamic interplay between chronic and cyclical hypoxia (18). The levels of fluctuating and hypoxic fractions depend on the tumor type, presence of necrosis, vascular stability and oxygen consumption. The fluctuating volume percentage has also been shown to depend on the study methodology, with published estimates varying between 0% and 80% (17).

Non-invasive measurement of cycling tumor hypoxia is challenging in patients due to the need for multiple data time points. Most of the methodologies that have been successfully used to study varying levels of hypoxia in pre-clinical studies are not applicable to clinical studies. Invasive studies of superficial

human tumors using laser Doppler flow measurement demonstrated significant changes in micro-regional blood flow in 54% of the regions monitored over a 60 minute period (47, 48). Around 19% of the observed perfusion changes were reversed over a time course of 4-44 min. A modeling study using serial pre-treatment ^{18}F -FMISO-PET scans in patients with HNSCC reported that acute hypoxia ranged from 13% to 52% (49). In our study, fluctuating volume percentage varied between 0 and 23%. The level of fluctuations was consistent between the scans: mean values of fluctuating volume percentage measured in two MRI visits did not differ statistically ($P = 0.12$) confirming robustness of methodology and prevalence of cycling oxygenation changes in HNSCC tumors. Assuming the average patient value of systemic hematocrit (0.4) as the value of microvascular hematocrit, and a hypoxic range of blood oxygenation between 0 and 0.3, the maximum observed ΔR_2^* ($\sim 40 \text{ s}^{-1}$) would correspond to a 0.2 change in blood oxygenation at 3T (45). This would equate to a change of between 0 and 16 mmHg (human blood, coefficient for blood oxygen binding: 2.26, temperature: 37°C , pH: 7.4).

Intriguingly, the difference of the mean fluctuating volume percentage between responding and non-responding patient groups approached statistical significance ($P = 0.051$), indicating the potential of R_2^* fluctuating volume percentage as a predictive and prognostic biomarker in HNSCC. This warrants further evaluation in a larger patient group.

Several limitations of this study should be considered. Patient HNSCC primary tumor sites (e.g. base of tongue, pharynx) were affected by significant

internal motion that could not be compensated for and hence led to exclusion from the analysis. One possible way to reduce this issue would be to use customised oral stents (50). This may decrease patient comfort however and the tolerability would have to be assessed. Another limitation is the restricted coverage of the serial multiple gradient echo at the required temporal resolution. This limited our analysis to the centre part of primary tumors and co-planar local lymph nodes. Echo planar imaging (EPI) readouts, commonly used in serial IS-MRI studies of brain activity, may improve this aspect (51). These sequences are however prone to distortion artifacts in the vicinity of air and tissue interfaces, which is likely to affect HNSCC primary tumor analysis (52). Lastly, the prevalence and spatial distribution of oxygen fluctuation in patients was correlated to the transfer constant K^{trans} estimated using DCE MRI, but not to the absolute level of chronic hypoxia, which is a common and well-recognized cause of radioresistance in HNSCC. MRI-based methods to identify chronic hypoxia employing hyperoxic challenge-induced changes in R_2^* and R_1 have recently been proposed (53-55) and could be combined with serial IS-MRI in future studies to provide information on the impact of both cycling and chronic hypoxia on patient treatment.

In conclusion, we demonstrated the feasibility of oxygen fluctuation mapping in HNSCC xenografts and translation to patient tumors using a clinical 3T MRI system. Our results suggest the presence of fluctuating blood oxygen levels in regions of impaired vasculature, but not in necrotic avascular parts of the tumor.

Figure Captions:

Figure 1 A: Representative parametric R_2^* map (range: 0 – 100 s^{-1} , axial orientation) calculated for a CAL^R HNSCC xenograft, with the tumor ROI delineated in blue. R_2^* time series (**B**, **C**) were used to calculate corresponding power spectra (**E**, **F**) and tested for the presence of non-random fluctuations. Significant non-Gaussian R_2^* fluctuations (white voxels in binary maps **D**), in the frequency range of 0-0.005 Hz were spatially mapped (chi-square test: at least one coefficient above $P = 0.05$, **B – D**).

Figure 2 T_2 -weighted axial MRI images (**A**) and corresponding binary maps showing the spatial distribution of spontaneous non-Gaussian R_2^* fluctuations (**B**) within tumor ROI's (white voxels) for CAL^R HNSCC xenografts (central slices). **C:** Composite images of the corresponding tumor sections showing the distribution of Hoechst 33342 (perfusion, blue), pimonidazole adducts (hypoxia, green) and CD31 (endothelial cell expression, red).

Figure 3 Examples of T_2 -weighted axial MRI images of HNSCC patients (**A**). Distribution of spontaneous R_2^* fluctuations (**B**) within tumor ROI's (white voxels) is presented for a primary tumor site (I, Pt No: 1), necrotic node (II, Pt No: 2) uniformly and non-uniformly contrast enhancing nodes (III, Pt No: 8 and IV, Pt No: 7). **C:** Corresponding DCE maps showing distribution of volume transfer constant between blood plasma and extracellular extravascular space (K^{trans}).

Figure 4 MRI parametric maps for a stage IV HNSCC patient with a zoomed nodal ROI region. Transverse relaxation rate R_2^* (**A**), K^{trans} (**B**) and binary maps (**C**: MR1, **D**: MR2, two MR sessions 48 hours apart) showing spatial distribution of spontaneous non-Gaussian R_2^* fluctuations (white voxels) for a nodal ROI (Patient No 5, N2).

Authors' Contributions

Conception and design: RP, LW, LCJB, MAS, SAB, KJH, CMN, MOL, SPR, KLN

Development of methodology: RP, LW, LCJB, MAS, Jd'A, MOL, SPR, KLN

Acquisition of data: RP, LW, LCJB, KHW, GH, CR

Analysis and interpretation of data: RP, LW, LCJB, MAS, KHW, AMR, DMK, AD, DM

Writing, review, and/or revision of the manuscript: RP, LW, LCJB, MAS, KHW, AR, DMK, AD, DM, Jd'A, SAB, KJH, CMN, GH, CR, CB, SAE, MOL, SPR, KLN

Administrative, technical, or material support: CB, SAE, GH, CR

Study supervision: MAS, KJH, MOL, SPR, KLN

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Figure 1

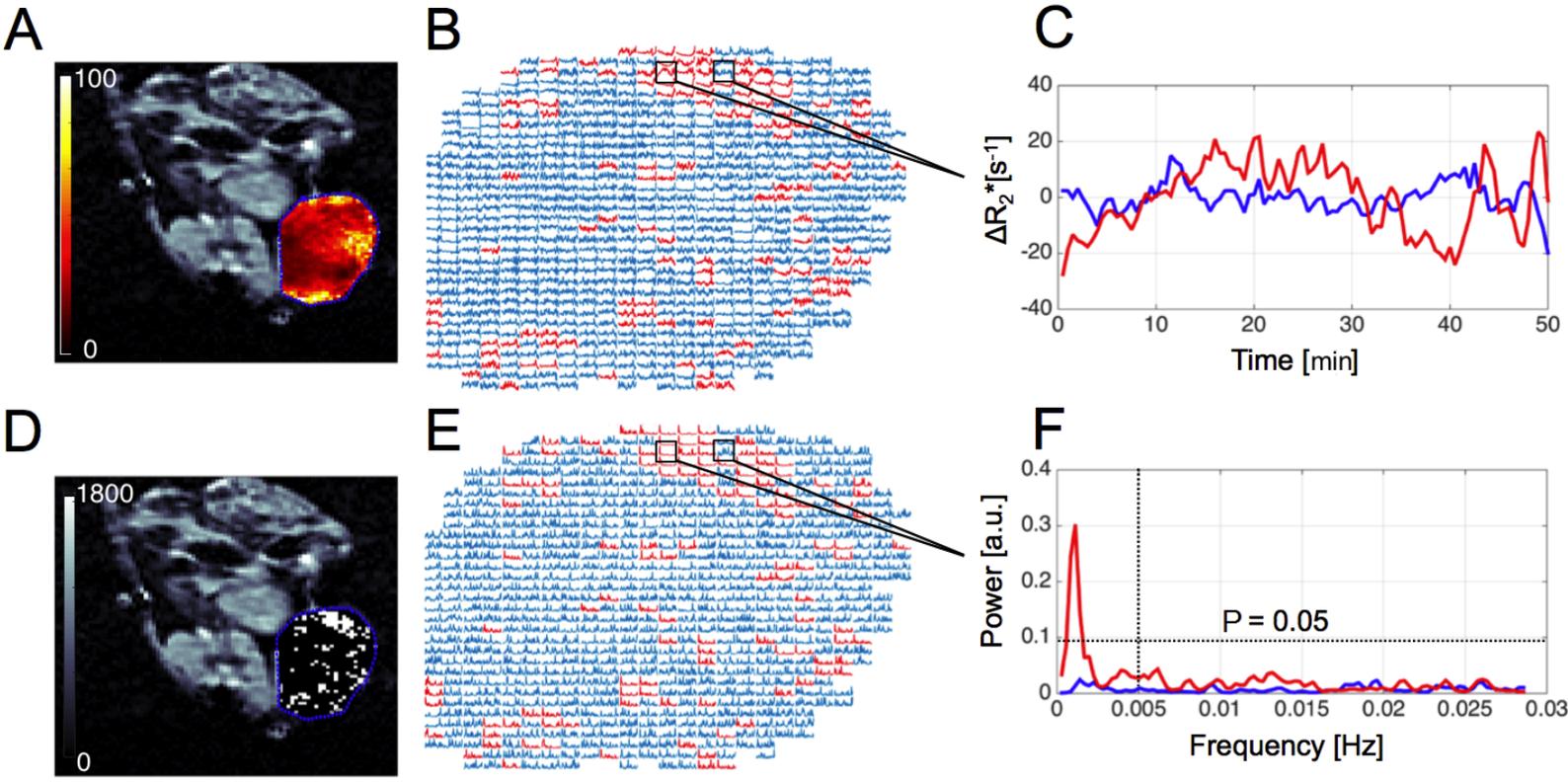


Figure 2

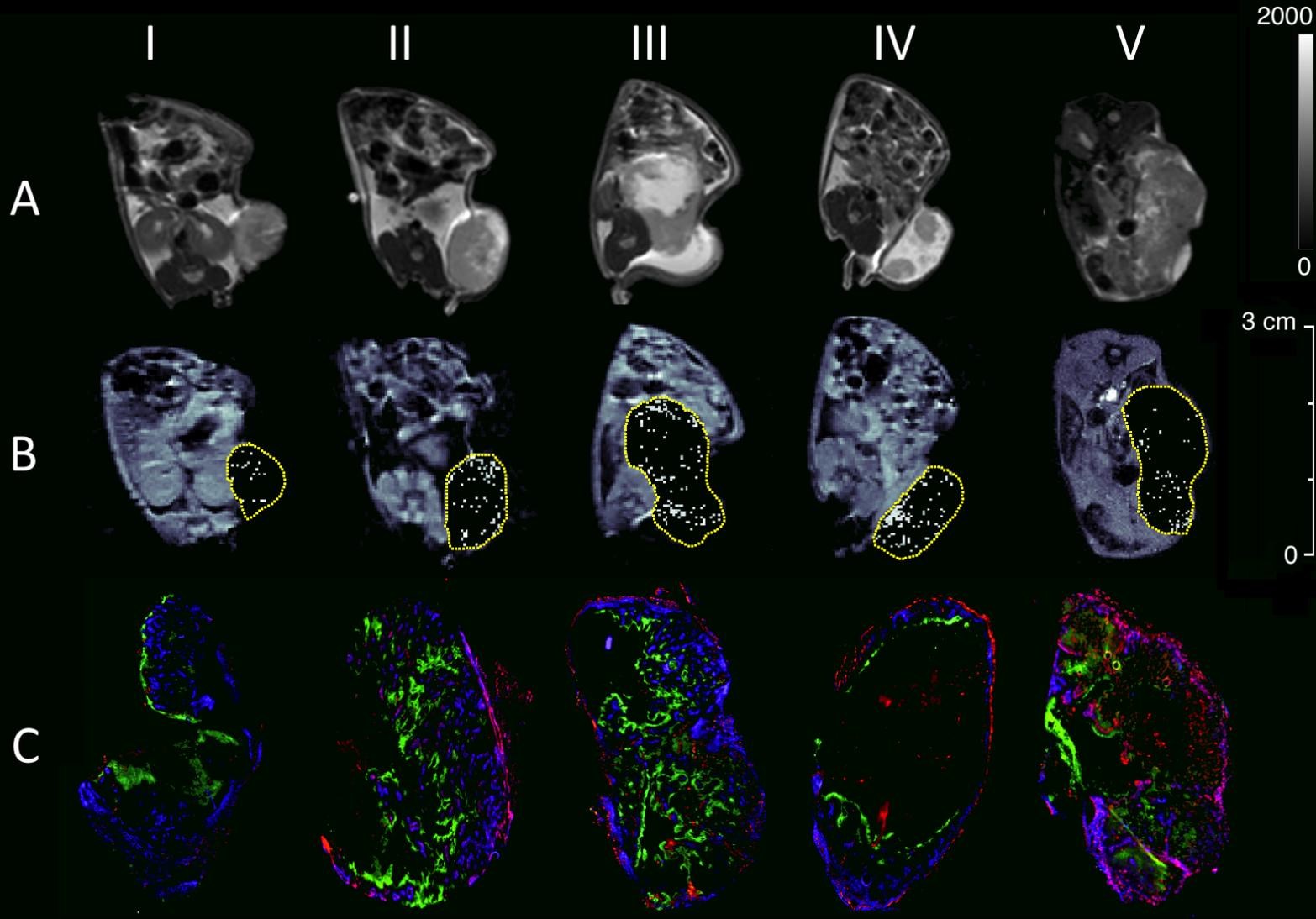


Figure 3

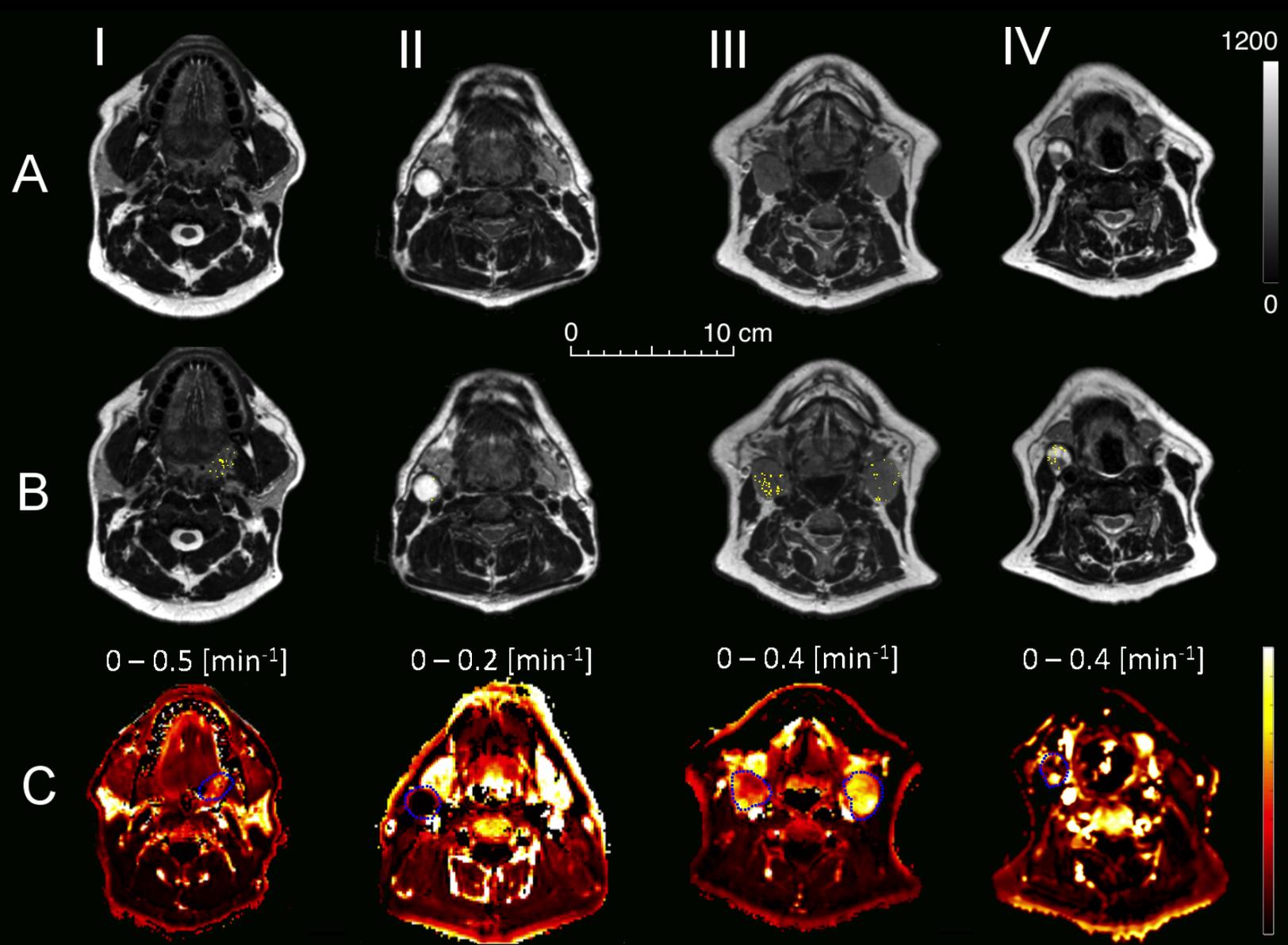


Figure 4

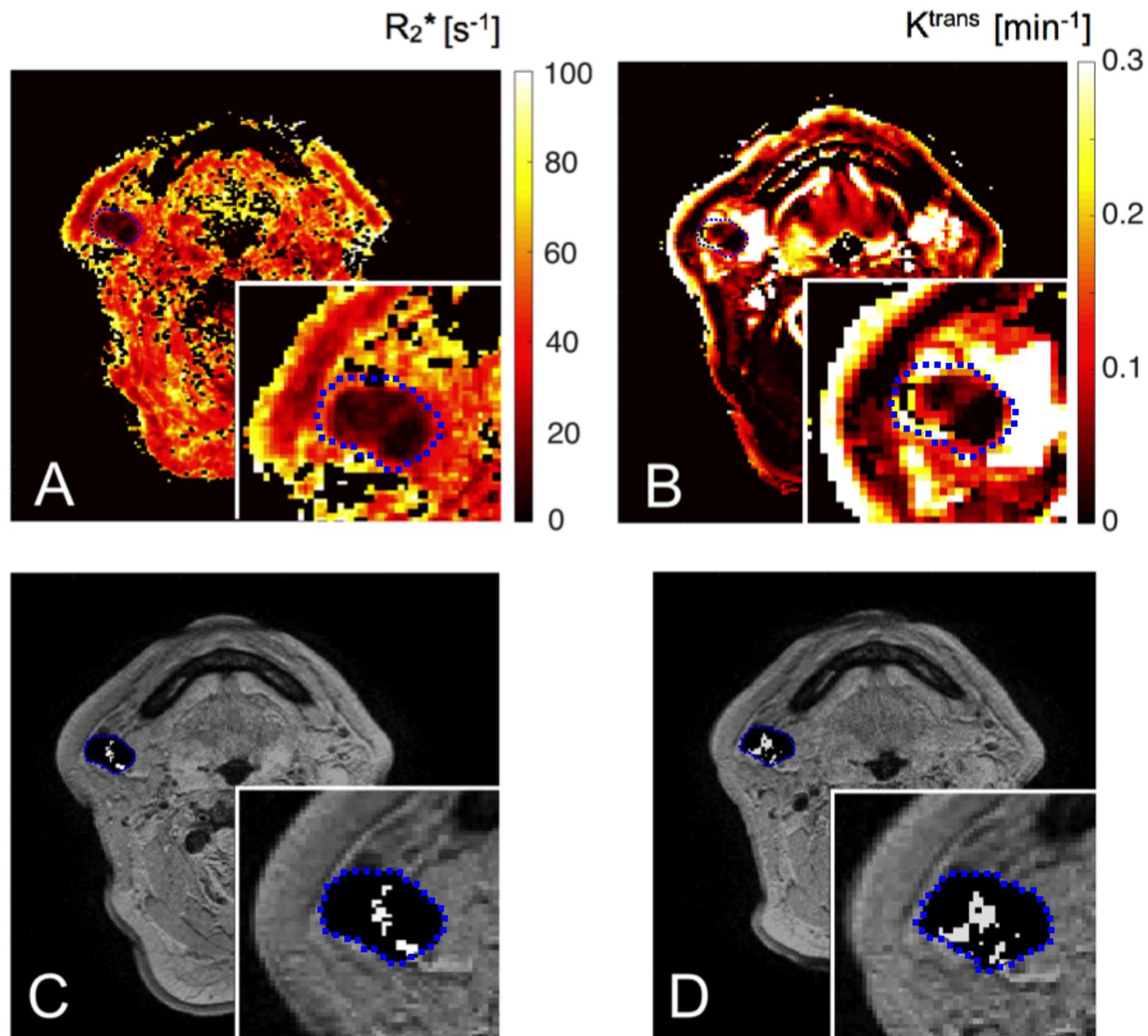


Table 1 Summary of CAL^R Tumour Characteristics

Mouse No.	Tumour volume [cc]	H33342 fraction [%]	Pimonidazole fraction [%]	R₂* [s⁻¹]	Fluctuating volume [%]
1	0.41	14	7	32	4
2	0.48	10	17	50	10
3	0.94	13	21	26	7
4	0.59	5	2	27	11
5	0.92	8	7	34	8
Median	0.59	10	7	32	8

Table 2. Summary of Patient Tumour Characteristics

Pt	Primary site	Primary Tumours					Lymph Nodes					Outcome
		P vol [cc]	R ₂ * [s ⁻¹]	K ^{trans} [min ⁻¹]	MR1 Fluct. Vol. [%]	MR2 Fluct. Vol. [%]	LN vol [cc]	R ₂ * [s ⁻¹]	K ^{trans} [min ⁻¹]	MR1 Fluct. Vol. [%]	MR2 Fluct. Vol. [%]	
1	Oropharynx	12	50	0.153	1	4	15	52	0.264	1	1	R
							2	51	0.186	2	10	
2	Oropharynx	32	54	0.079	NA	NA	3	38	0.046	0	0	R
3	Supraglottis	27	54	0.135	NA	NA	2	42	0.277	4	6	NR
4	Oropharynx	29	47	0.112	2	1	-	-	-	-	-	R
5	Oropharynx	173	54	0.147	0	2	6	48	0.129	8	23	NR
							2	44	0.102	14	8	
6	Supraglottis	12	56	0.145	NA	NA	15	43	0.215	3	1	NR
7	Oropharynx	-	-	-	-	-	5	38	0.139	7	5	NR
8	Supraglottis	-	-	-	-	-	10	35	0.242	2	8	R
							15	41	0.346	1	4	
9	Oropharynx	-	-	-	-	-	17	45	0.060	1	2	R
10	Oropharynx	45	56	0.117	1	4	-	-	-	-	-	R
Median		28	54	0.135	1	3	5	43	0.186	2	5	

“-”: no primary / lymph node in the imaged volume, “NA”: data not available due to extensive motion, “R/NR” – responder / non-responder;