



Repeatability of MR fingerprinting in normal cervix and utility in cervical carcinoma

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Background: Magnetic resonance fingerprinting (MRF) is a fast-imaging acquisition technique that generates quantitative and co-registered parametric maps. The aim of this feasibility study was to evaluate the agreement between MRF and phantom reference values, scan-rescan repeatability of MRF in normal cervix, and its ability to distinguish cervical carcinoma (CC) from normal cervical tissues.

Methods: An International Society of Magnetic Resonance in Medicine/National Institute of Standards and Technology (ISMRM/NIST) phantom was scanned using MRF 15 times over 65 days. Agreement between MRF and phantom reference T1 and T2 values was assessed by linear regression. Healthy volunteers and patients with suspected CC were prospectively recruited. MRF was repeated twice for healthy volunteers (MRF1 and MRF2). Volumes of interest of normal cervical tissues and CC were delineated on T1 and T2 maps. MRF scan-rescan repeatability was evaluated by Bland-Altman plots, within-subject coefficients of variation (wCV), and intraclass correlation coefficients (ICC). T1 and T2 values were compared between CC and normal cervical tissues using Mann-Whitney U test. Receiver operating characteristic (ROC) analysis was performed to evaluate diagnostic efficiency.

Results: Strong correlations were observed between MRF and phantom ($R^2=0.999$ for T1, 0.981 for T2). Twelve healthy volunteers (28.7±5.1 years) and 28 patients with CC (54.6±15.2 years) were recruited for the *in-vivo* experiments. Repeatability of MRF parameters were wCV <3% for T1, <5% for T2 and ICC ≥0.92 for T1, ≥0.94 for T2. T1 value of CC (1,529±112 ms) was higher than normal mucosa [MRF1: 1,430±129 ms, MRF2: 1,440±130 ms; P=0.031, area under the curve (AUC) ≥0.717] and normal stroma (MRF1: 1,258±101 ms, MRF2: 1,276±105 ms; P<0.001, AUC ≥0.946). T2 value of CC (69±9 ms) was lower than normal mucosa (MRF1: 88±16 ms, MRF2: 87±13 ms; P<0.001, AUC ≥0.854), but was not different from normal stroma (P=0.919).

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Conclusions: Excellent agreement was observed between MRF and phantom reference values. MRF exhibited excellent scan-rescan repeatability in normal cervix with potential value in differentiating CC from normal cervical tissues.

Keywords: Magnetic resonance fingerprinting (MRF); quantitative magnetic resonance imaging (quantitative MRI); cervical carcinoma (CC); repeatability

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Introduction

Conventional quantitative magnetic resonance imaging (MRI) techniques that aim to estimate MR parameters—such as T1, T2, and apparent diffusion coefficient—are sensitive to variations in the content of metabolites and tissue components. Diffusion-weighted imaging is routinely used in the diagnosis and assessment of pelvic diseases, but quantitative T1 and T2 mappings have not been adopted in routine clinical practice. These are challenging to image in moving regions, including the abdomen and pelvis, due to long acquisition times (1,2).

Magnetic resonance fingerprinting (MRF) is a fast imaging acquisition technique that can overcome the limitations of conventional T1 and T2 mapping (3). It is based on the premise that MR parameters can be reliably estimated from the evolution of MR signals, known as MR fingerprints, that are acquired with pseudorandomised acquisition parameters, such as repetition times and flip angles (3). To estimate MR parameters, MRF is matched against a precomputed dictionary, which contains a library of MRI signal evolution of different biological tissues, on a voxel-by-voxel basis. MRF thus permits the estimation of quantitative and co-registered parametric maps from a single sequence (1).

Conventional T1- and T2-weighted imaging are part of the routine set of sequences for diagnosis and assessment of various cancers. However, these sequences do not directly provide quantitative assessment of pathophysiological changes in tissues. Additionally, early subtle changes within the tumours could not be readily appreciated even by experienced radiologists unless the tumours change sufficiently in size, morphology or intensity (4). Thus, these conventional sequences without quantitative measurements have a limited role in the detection of early changes in the tumour microenvironment. On the other hand, MRF may be a promising alternative by providing quantitative metrics that

could evaluate the biological characteristics of tumours based on the various contrast mappings which can be acquired in a single sequence. Given these advantages, MRF has the potential to estimate multiple and useful imaging parameters, which can be implemented for cancer characterisation and treatment response assessment and potentially incorporated in radiomics and machine-learning (4,5).

In order to be clinically useful, quantitative parameters, such as T1 and T2 values derived from MRF, need to have high repeatability and reproducibility (6). Initiatives like the Quantitative Imaging Biomarkers Alliance (QIBA) investigate the standardisation and reliability testing of such quantitative techniques in order to translate these biomarkers into clinical practice (7). Numerous studies have reported good to excellent repeatability and reproducibility of MRF *in vivo* even across MRI platforms of different field strengths (8-13). Recent studies have demonstrated the application of MRF in the brain (4,8,9,13-16), and preliminary investigations in other body parts, including breast, liver, kidney, prostate and ovaries (2,5,10,17-23). Furthermore, MRF has shown the potential ability in differentiating cancers from normal tissues and distinguishing primary tumours from metastases (15,20,21). Nevertheless, MRF in cervical carcinoma (CC) has hitherto not been investigated. The aims of this feasibility study were to evaluate the agreement between MRF and phantom reference values, scan-rescan repeatability of MRF in normal cervix and to explore the ability of MRF in discriminating CC from normal cervical tissues.

Methods

The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). This prospective study was approved by the local Institutional Review Board, and informed consent were obtained from

all the study subjects.

Study subjects recruitment

Twelve healthy volunteers were recruited for pelvic MRI and MRF between December 2019 and April 2020. The inclusion criteria for healthy volunteers were those (I) without clinical symptoms and (II) no prior history of hormone therapy, gynaecological conditions or pelvic surgery.

Initially, 33 patients with clinically visible cervical masses were prospectively recruited and underwent pelvic MRI and MRF between June 2019 and March 2020. The inclusion criterion for patients was histologically confirmed CC. Exclusion criteria included (I) prior history of pelvic surgery, chemoradiation or other malignancy, (II) cervical tumour that did not originate from the cervix, and (III) severe motion artefacts observed on MRI or MRF maps.

Clinicopathological assessment

Cervical biopsies from clinically suspected CC were assessed by a pathologist with more than 10 years' experience in gynaecological malignancy; and reviewed at multi-disciplinary team meetings. The assessed histopathological markers included histological subtypes and tumour grades, according to the WHO Classification of Tumours of Female Reproductive Organs (24). All cases were staged using the revised 2018/2019 International Federation of Gynecology and Obstetrics (FIGO) staging for CC based on MRI by a board-certified radiologist (R1: >10 years' experience in pelvic MRI) (25).

MRF acquisition and processing

We have implemented an in-house single-slice inversion-recovery fast imaging protocol with steady-state free precession for MRF acquisition and an in-house MRF reconstruction pipeline, which consisted of spiral reconstruction using non-uniform Fourier Transform (26), dictionary generation using the extended phase graph algorithm (27), and in-house dictionary matching written in MATLAB (R2017b, The MathWorks, Natick, MA, USA), similar to references (3,16). All MRI examinations were performed using a 3.0 T MRI scanner (Achieva 3T TX, Philips Healthcare Best, the Netherlands). Dictionary matching was done on a machine equipped with an Intel Xeon Gold 6428 (20 cores @ 2.50 GHz) and 500 GB

of random access memory (RAM), and matching took approximately 6 minutes per slice. The generated T1 and T2 maps were co-registered, as the maps were reconstructed from the same base MRF signal in postprocessing.

MRF in phantom

MRF was performed on the standard International Society of Magnetic Resonance in Medicine/National Institute of Standards and Technology (ISMRM/NIST) MRI system using an 8-channel phase array brain and dorsal coils for signal reception as previously described in reference (28). MRF protocol and dictionary details may be found in *Table 1*. An additional 5 s delay was needed before each acquisition to ensure the net magnetization to be in its thermal equilibrium state, the resulting scan time per slice was 19 s. The phantom was scanned 5 times per session over 15 sessions throughout 65 days.

Circular regions of interest (ROIs) of 6 T1 and 11 T2 fiducial spheres from all repetitions in each session were contoured. The mean and standard deviation of T1 and T2 values over all voxels in the ROI were measured for all 15 sessions. Measured T1 and T2 values from MRF were averaged across the 15 acquisitions. T1 spheres had reference values ranging from 367 to 1,838 ms, while T2 spheres had reference values ranging from 15 to 646 ms. As we aimed to evaluate the T1 and T2 values with the ranges observed in biological tissues, T1 spheres 7 to 14 and T2 spheres 12 to 14 which contained lower T1 and T2 values were excluded from our measurements.

MRF in-vivo

MRI was performed with a 16-channel phased-array torso coil for signal reception. All the subjects fasted for 6 hours and received 20 mg intravenous hyoscine butylbromide (Buscopan, Boehringer Ingelheim, Germany) before MRI examinations to reduce peristaltic artefacts. Conventional MRI and MRF protocols were standardised for all subjects and the MRF protocol was identical to that used in the phantom experiment (*Tables 1,2*). The dictionary was computed with range and increments tabulated in *Table 1* (5). For healthy volunteers, the same MRF protocol was performed twice (MRF1 and MRF2) with a 10-minute break interval (4,10). For patients with CC, MRF was only performed once after conventional sequences. Eight to fourteen slices of MRF sequence were performed for each subject, the scanning range covered the whole normal cervix

Table 1 The dictionary and acquisition parameters for MRF

MR parameter	Values	
	Range (ms)	Increment (ms)
Phantom		
T1 dictionary	300–6,000	15
T2 dictionary	10–6,000	5
<i>In-vivo</i>		
T1 dictionary	10–400	10
	400–4,000	20
T2 dictionary	2–20	1
	20–400	2
	400–2,500	20
Readout	Variable density spiral-in-spiral-out	
Acquisition window (ms)	8.6	
Acquisition factor	58.4	
Trajectory rotation after each dynamic	222.5°	
Repetition time (ms)	12.1–14.1	
Flip angle	0–60°	
Field of view (mm ²)	300×300	
Acquisition matrix	256×256	
Image resolution (mm ²)	1.17×1.17	
Slice thickness (mm)	5	
Number of slices	8–14	
Time per slice (sec)	14	
Number of channels	16	
Number of dynamics	1,000	
Number of spiral interleaves	1	

MRF, magnetic resonance fingerprinting.

or the entire tumour of all patients.

Normal cervix and CC delineation

First, a second radiologist (R2; board-certified with 3 years' experience in pelvic MRI) delineated the volumes of interest (VOIs) of normal cervical tissues and CC using open-source ImageJ software (1.53d, National Institutes of Health, USA) and the VOIs were subsequently verified by R1. In cases of disagreement, VOIs were revised in consensus. As axial T2-

weighted images had corresponding imaging slices to MRF maps, axial and sagittal T2-weighted images were taken as references when drawing VOIs on the T1 and T2 maps obtained from MRF. VOIs were individually delineated on T1 maps first and then copied to T2 maps as these maps were co-registered. Mean T1 and T2 values of healthy volunteers and patients with CC were computed over all voxels in the VOIs using an in-house MATLAB script.

For healthy volunteers, the VOIs of cervical mucosa and stroma were individually delineated on the T1 and T2 maps of MRF1 (*Figure 1*). The central canal was excluded from the delineation of cervical mucosa. The same procedure was repeated on the T1 and T2 maps obtained from MRF2 (*Figure 2*). For patients with CC, the VOIs of CC were drawn by strictly delineating the border of CC from adjacent normal tissue on each slice to cover the full extent of the tumours on the T1 and T2 maps (*Figure 3*).

Statistical analysis

Linear regression was performed, and the coefficient of determination (R^2) was calculated to assess the agreement of T1 and T2 values between MRF and phantom reference values. Bland-Altman plots were used to evaluate the repeatability of MRF scan-rescan on healthy volunteers. The bias and limits of agreement of Bland-Altman plots represent the mean difference and the range of variation between the two measurements, respectively. Within-subject coefficients of variation (wCV), two-way mixed, single score, agreement intraclass correlation coefficients {ICC [2, 1]} were respectively defined in Eq. [1] and Eq. [2] (29,30):

$$wCV = \frac{\sigma}{\mu} \quad [1]$$

$$ICC = \frac{\tau^2}{\tau^2 + \sigma^2} \quad [2]$$

where σ represents measurement standard deviation, μ measurement mean, and τ measurement variance. The repeatability of MRF with ICC of 0.50 was regarded as poor, 0.50–0.75 moderate, 0.75–0.90 good or >0.90 excellent (30). Continuous variables were tested for normality using Shapiro-Wilk test. Mann-Whitney U tests were used for comparing the difference in T1 and T2 values between CC and normal cervical tissues, and the Benjamini-Hochberg procedure was used for multiple comparisons correction. A P value <0.05 was considered as statistical

Table 2 Conventional MRI protocols

Sequences	T2W TSE	T2W TSE SPAIR	T2W TSE	T1W TSE	DWI
Plane	Sagittal	Coronal	Axial	Axial	Axial
TR/TE (ms)	4,000/80	3,500/80	2,800/100	483/10	2,000/54
Turbo factor	30	21	12	5	NA
FOV (mm)	240×240	230×230	402×300	200×359	406×300
Matrix size	480×298	352×300	787×600	332×434	168×124
Slice thickness (mm)	4	4	4	5	4
Bandwidth (Hz/pixel)	230	186	169	218	15
Number of excitations	2	1	1	1	2

MRI, magnetic resonance imaging; T2W, T2-weighted; TSE, turbo spin echo; SPAIR, spectral attenuated inversion recovery; T1W, T1-weighted; DWI, diffusion-weighted imaging; TR/TE, repetition time/echo time; FOV, field of view.

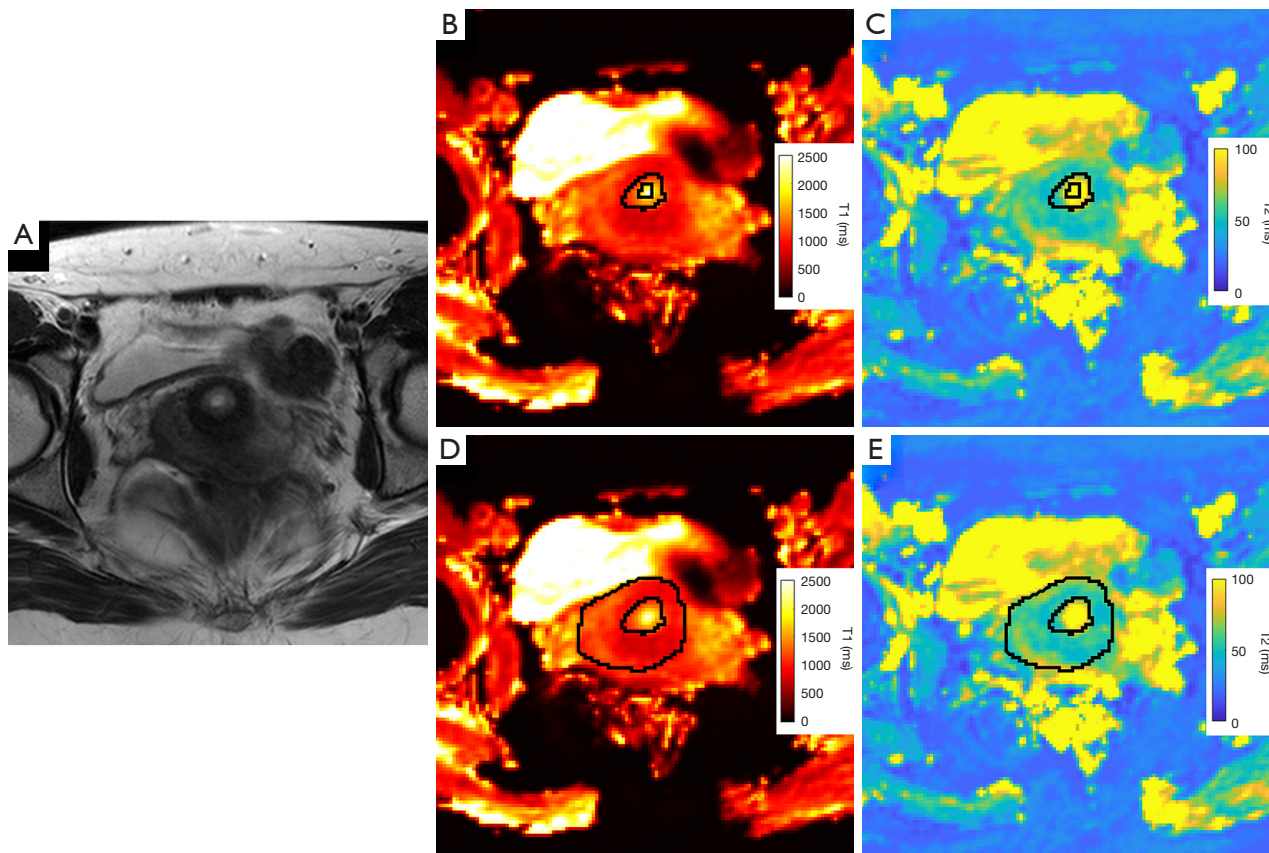


Figure 1 A 26-year-old female healthy volunteer. (A) Axial T2-weighted image, (B,D) T1 maps and (C,E) T2 maps. Representative VOIs of mucosa (B,C) and stroma (D,E) were shown on the T1 and T2 maps. The VOIs appear as a pair of black rings, and the included area were the pixels between the inner and outer rings; the area within the inner ring was excluded. VOI, volume of interest.

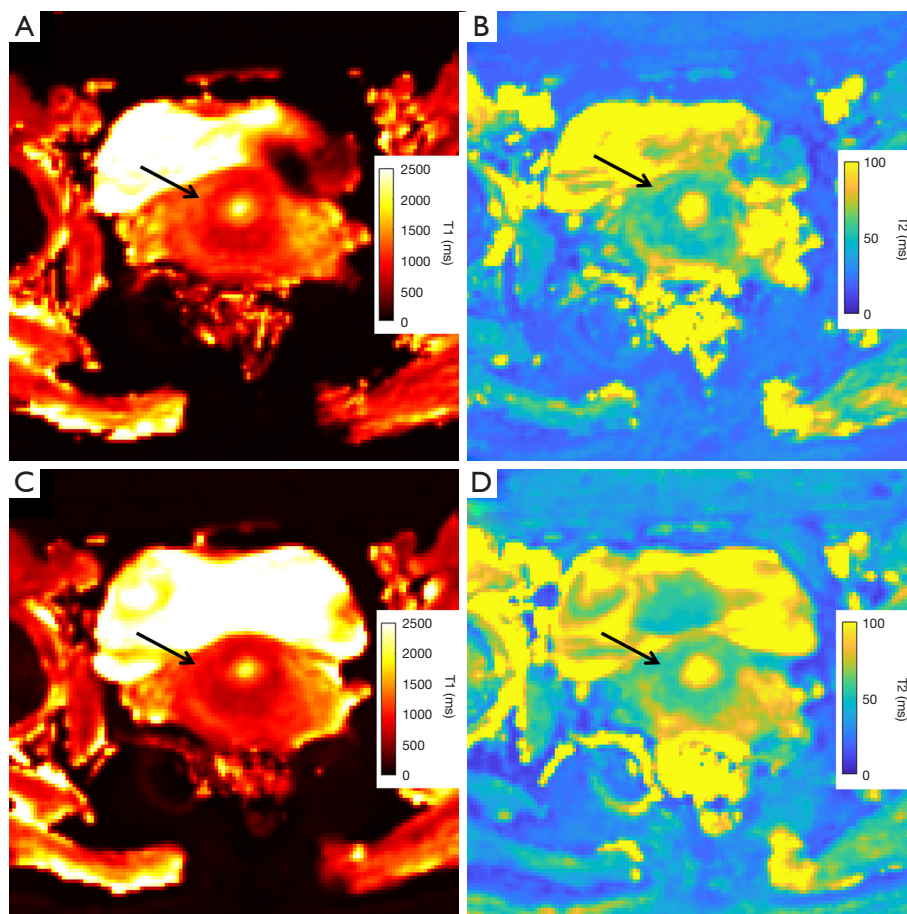


Figure 2 A 26-year-old female healthy volunteer. (A,C) Scan-rescan T1 maps and (B,D) scan-rescan T2 maps. The normal cervix was shown (arrow).

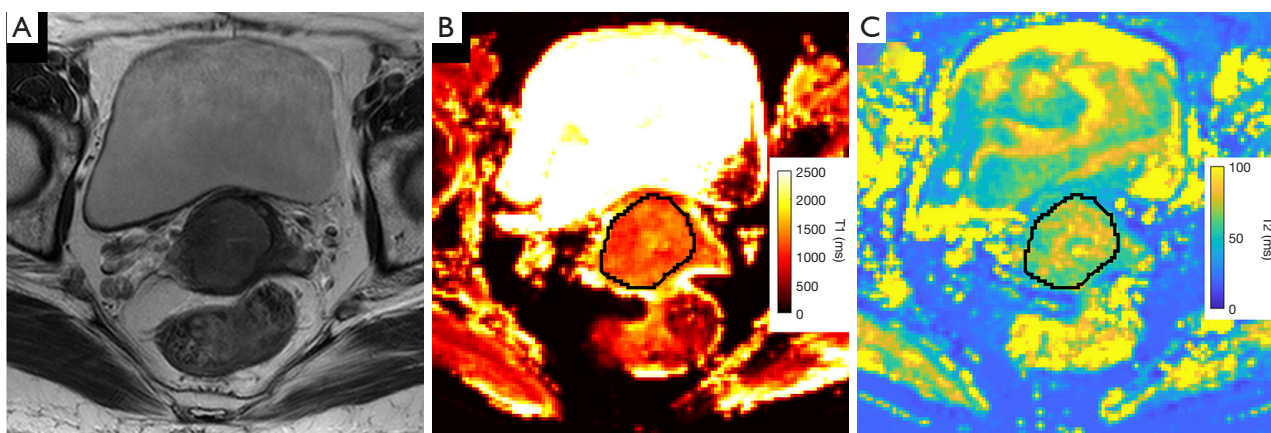


Figure 3 A 64-year-old woman with squamous cell carcinoma, tumor grade G3 and FIGO stage IIB. (A) Axial T2-weighted image, (B) T1 map and (C) T2 map. Representative VOI of the CC on T1 and T2 maps were also shown (VOIs appear as black circles). FIGO, International Federation of Gynecology and Obstetrics; VOI, volume of interest; CC, cervical carcinoma.

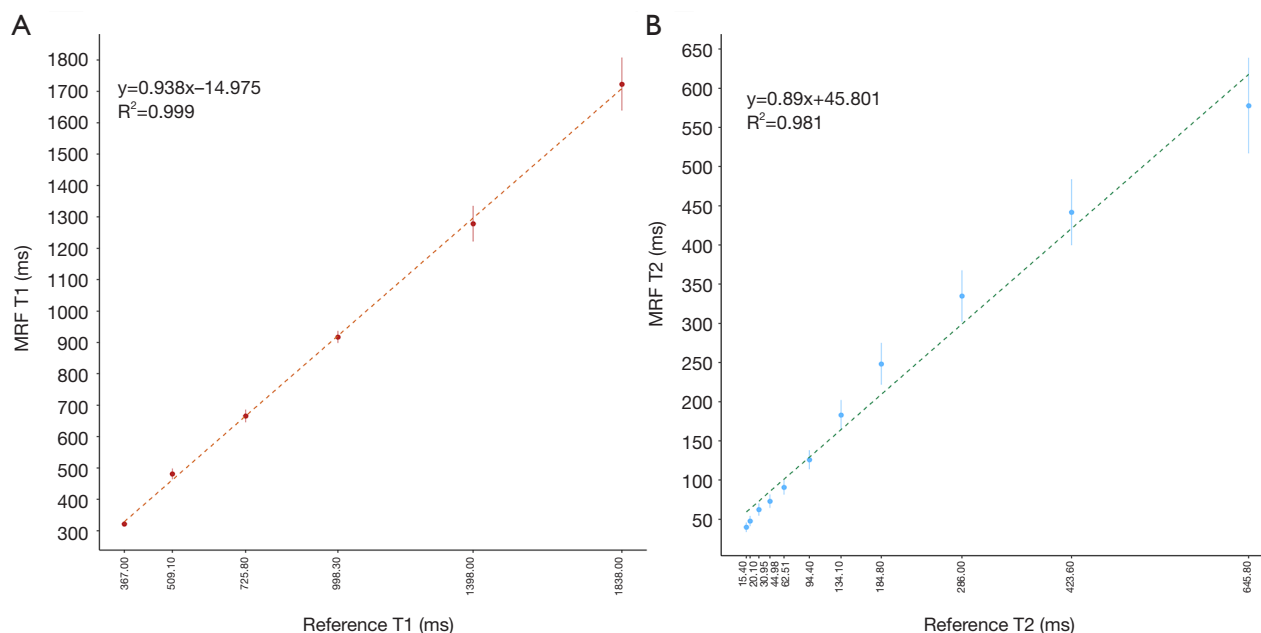


Figure 4 Scatterplots with standard deviation bars showing the linearity of the (A) T1 and (B) T2 values estimated from MRF averaged across 15 acquisitions and ISMRM/NIST phantom reference values. MRF, magnetic resonance fingerprinting; ISMRM, International Society of Magnetic Resonance in Medicine; NIST, National Institute of Standards and Technology.

significance. Receiver operating characteristic (ROC) analysis was performed, and the area under the curve (AUC), sensitivity and specificity were used for the evaluation of the diagnostic efficiency and cut-off values. AUC of 0.7–0.8 was considered acceptable, 0.8–0.9 was considered excellent and >0.9 was considered as an outstanding accuracy (31). All the statistical analyses were performed using in-house R scripts (3.6.2, R Core Team, Vienna, Austria).

Results

Phantom experiment

Coefficient of determination between MRF-derived T1 and T2 values with reference values was $R^2=0.999$ for T1 and 0.981 for T2 (28). The correlation plots were shown in *Figure 4*.

Demographics and clinical characteristics

In total, 12 healthy volunteers (28.7 ± 5.1 years; range, 24–43 years) were enrolled. Of the 33 patients, 5 were excluded, thus 28 patients with histologically confirmed CC (54.6 ± 15.2 years; range, 31–82 years) were analysed. A diagram of patient selection was shown in *Figure 5*. The

demographics and clinical characteristics of patients with CC were shown in *Table 3*.

MRF scan-rescan repeatability of normal cervix

The wCV of MRF-derived T1 and T2 values in the mucosa were 1.90% and 4.25%, respectively, and those in the stroma were 2.44% and 3.47%, respectively. The ICC for T1 and T2 in the mucosa were 0.96 and 0.94, respectively, and in the stroma, they were 0.92 and 0.95, respectively. Bland-Altman analysis showed that T1 values of mucosa and stroma had similar biases and limits of agreement. Furthermore, T2 values of mucosa and stroma had similar biases, but T2 stroma had tighter limits of agreement. Bland-Altman plots were shown in *Figure 6*.

Comparison between CC and normal cervical tissues

CC had an average T1 value of $1,529\pm 112$ ms and was significantly higher than normal mucosa ($P=0.031$, compared with MRF1 and MRF2) and stroma ($P<0.001$, compared with MRF1 and MRF2). CC had an average T2 value of 69 ± 9 ms and was significantly lower than normal mucosa ($P<0.001$, compared with MRF1 and MRF2). A

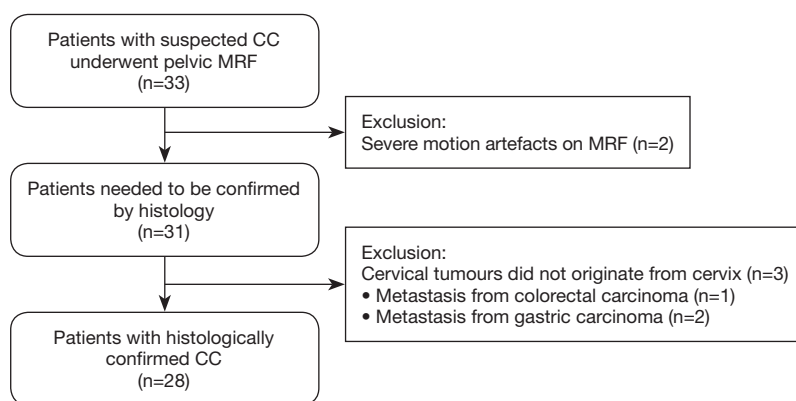


Figure 5 Diagram of patient selection. CC, cervical carcinoma; MRF, magnetic resonance fingerprinting.

Table 3 Demographics and clinical characteristics of patients with CC

Demographics/clinical characteristics	Patients (n)
Number	28
Age (years)	54.6±15.2 (range, 31–82)
Histological subtypes	
SCC	22
ACA	4
Others*	2
Tumour grades	
G1	1
G2	14
G3	13
2018/2019 FIGO stages	
I	3
II	8
III	15
IV	2

*, other histological subtypes included one poorly differentiated carcinoma with neuroendocrine differentiation, and one 60% small cell neuroendocrine carcinoma admixed with 40% adenocarcinoma. CC, cervical carcinoma; SCC, squamous cell carcinoma; ACA, adenocarcinoma; FIGO, International Federation of Gynecology and Obstetrics.

full tabulation of the T1 and T2 values of CC and normal cervical tissues, as well as the cut-offs, AUC, sensitivity, and specificity, can be found in *Table 4* with corresponding box and whisker plots depicted in *Figure 7*.

Discussion

Preliminary studies of MRF have been applied in abdomen and pelvis, including liver, kidney, prostate and ovaries (2,5,10,17-23). However, the repeatability of MRF in normal cervix and the utility of MRF in CC have never been evaluated. In this feasibility study, strong correlations between MRF and phantom reference values and excellent scan-rescan repeatability of MRF in normal cervical tissues were demonstrated. Furthermore, the quantitative T1 and T2 parameters obtained from MRF were able to differentiate between CC and normal cervical tissues.

Our study evaluated the agreement between MRF and reference values provided by the ISMRM/NIST phantom. Strong agreements were observed with $R^2=0.999$ for T1, 0.981 for T2. A recent MRF study reported similar results of $R^2=0.996$ for T1, 0.997 for T2, which used the same ISMRM/NIST MRI system phantom (12). R^2 of T2 values was slightly lower in our measurements, which may be explained by the fact that B1 varies from day to day, thereby inducing greater variation in T2 values compared to T1 values (32). Moreover, it is expected that B1 inhomogeneity on 3.0 T would affect the accuracy of relaxation property

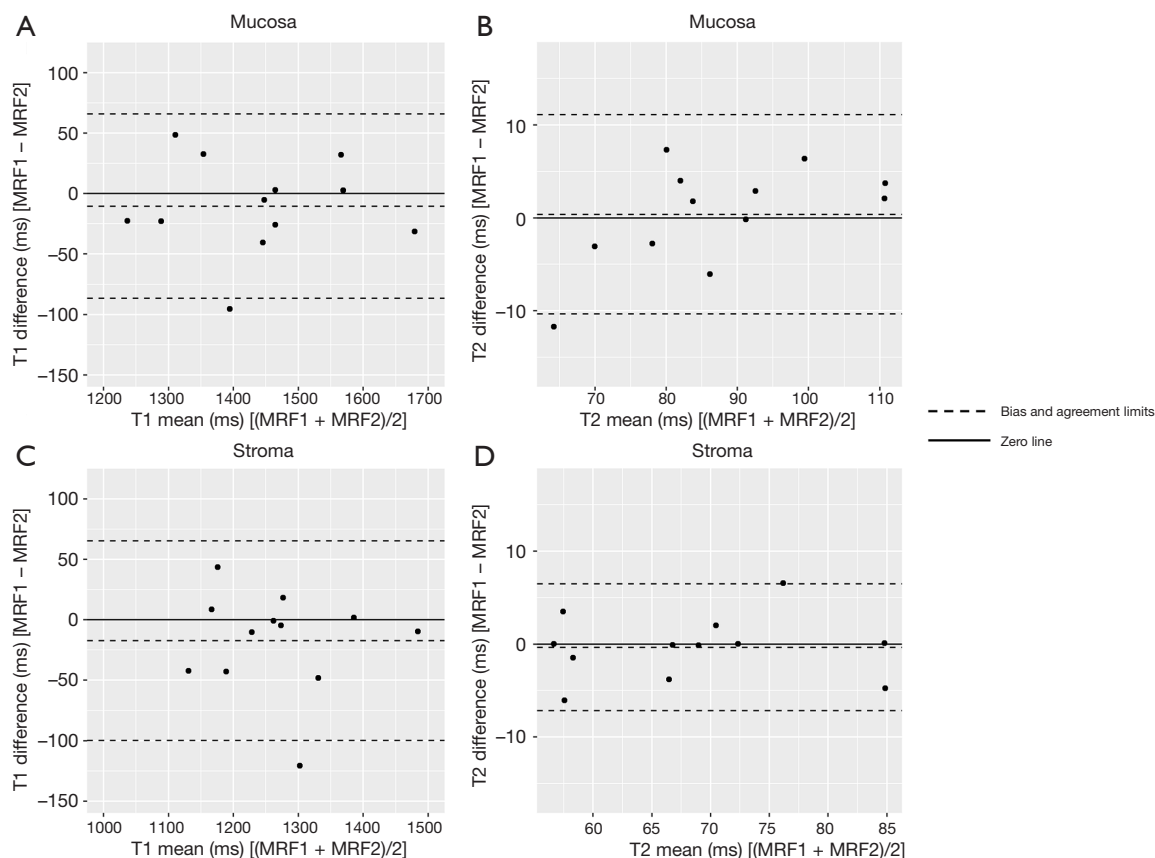


Figure 6 Bland-Altman plots of the T1 and T2 values of normal mucosa and stroma obtained from two different sessions of MRF, MRF1 and MRF2. The top row shows mucosa (A) T1 and (B) T2 plots while the bottom row shows stroma (C) T1 and (D) T2 plots. MRF, magnetic resonance fingerprinting.

mapping with more bias on estimated T2 than T1 (2,33).

High repeatability is paramount for any imaging techniques, such as quantitative MRI, that is intended for routine clinical use (6). It is, therefore, imperative that the repeatability of MRF for cervical imaging be evaluated. Our results showed that the wCV and ICC of MRF scan-rescan were all excellent for both T1 and T2 values, concordant with recent MRF studies in brain, breast and knee (8-10,13,34).

Considering that CC could arise from the endocervical canal, commonly found in the elderly population as the squamocolumnar junction recedes within the cervical canal, and could present as endophytic growth (35), we have performed separate analyses on mucosa and stroma to better understand the underlying changes in cervical tissues when CC develops. Our results showed that the T1 value of CC was significantly higher than that of normal mucosa and stroma, and the T2 value of CC was lower

than that of normal mucosa. Amongst the factors that could affect T1, variations in the concentration of mucin, a T1-shortening macromolecule, may contribute to a lower T1 value in normal cervical tissues than CC (36). The level of mucin production is variable in both normal cervix and CC. In normal cervical tissues, the mucin level of endocervical secretion changes within menstrual cycle (37). However, we did not investigate the effect of menstrual cycle and menopausal status on T1 and T2 values due to the limited sample size. In CC, mucin production is decreased in squamous cell carcinomas and increased in adenocarcinoma and adenosquamous carcinoma (38). As the majority of our cohort were squamous cell carcinomas, T1 values of CC would be expected to be higher than normal cervical tissues. These findings suggested that differences in mucin content may explain the variation in T1 values in cancerous and normal cervical tissues, though further investigations are required to elucidate the cause of T1 changes.

Table 4 The T1 and T2 values of CC and normal cervical tissues

	CC	Normal mucosa		Normal stroma	
		MRF1	MRF2	MRF1	MRF2
T1					
Values (ms)	1,529±112	1,430±129	1,440±130	1,258±101	1,276±105
Normal cervix vs. CC					
P value		0.031	0.031	<0.001	<0.001
Cut-off (ms)		1,477	1,483	1,308	1,387
AUC		0.723	0.717	0.967	0.946
Sensitivity		0.750	0.750	0.833	0.917
Specificity		0.750	0.750	1.000	0.857
T2					
Values (ms)	69±9	88±16	87±13	68±10	69±10
Normal cervix vs. CC					
P value		<0.001	<0.001	0.919	0.919
Cut-off (ms)		82	79	–	–
AUC		0.854	0.899	–	–
Sensitivity		0.750	0.750	–	–
Specificity		0.964	0.929	–	–

Data are means ± standard deviations. CC, cervical carcinoma; MRF, magnetic resonance fingerprinting; AUC, area under the curve.

For T2 values, that of CC was lower than normal mucosa, and not different from that of normal stroma. The normal stroma consists of fibromuscular tissues; the inner stroma contains a large amount of fibroblasts and smooth muscle cells, whereas the outer stroma has lower concentration of smooth muscle cells. The signal difference between inner stroma and outer stroma is conspicuous in young women and may be absent in the elderly (39). In our study, the majority of the healthy volunteers were young women, potentially affecting the T2 values of normal stroma. Furthermore, high vascularisation in the outer stroma and inflow phenomena may attribute to an increased T2 value (40). Both factors could be accounting for the similar T2 values between normal stroma and CC. Nevertheless, the lack of difference in T2 values of CC and normal stroma may suggest MRF-derived T2 value may have limited value in differentiating the normal stroma that surrounds the CC and could impact on longitudinal comparison during and after treatment.

To determine whether CC can be distinguished from normal cervical tissues based on T1 and T2 values, we have

performed ROC analysis. The AUCs for T1 and T2 were acceptable to outstanding, demonstrating their potential in differentiating CC from normal cervical tissues. These results concurred with findings in previous MRF studies in other tumour types which demonstrated that MRF could distinguish cancerous and normal tissues in the prostate and breast (20-22). It is, however, worth noting that the variations in T1 and T2 values in different tissue types were different compared to other studies, indicating that these variations may likely be organ-specific and disease-dependent.

Our study has several limitations. First, we did not perform a comparison in the T1 and T2 values between conventional quantitative MRI versus MRF. However, we have demonstrated good agreement between MRF and phantom reference values. A number of studies have reported high agreements in T1 and T2 values between MRF and conventional quantitative MRI (2,17,18). Second, our current MRF model assumed that all tissues are static and does not account for fluid flow (3). The present MRF sequence uses 2D slice selective excitation and the presence

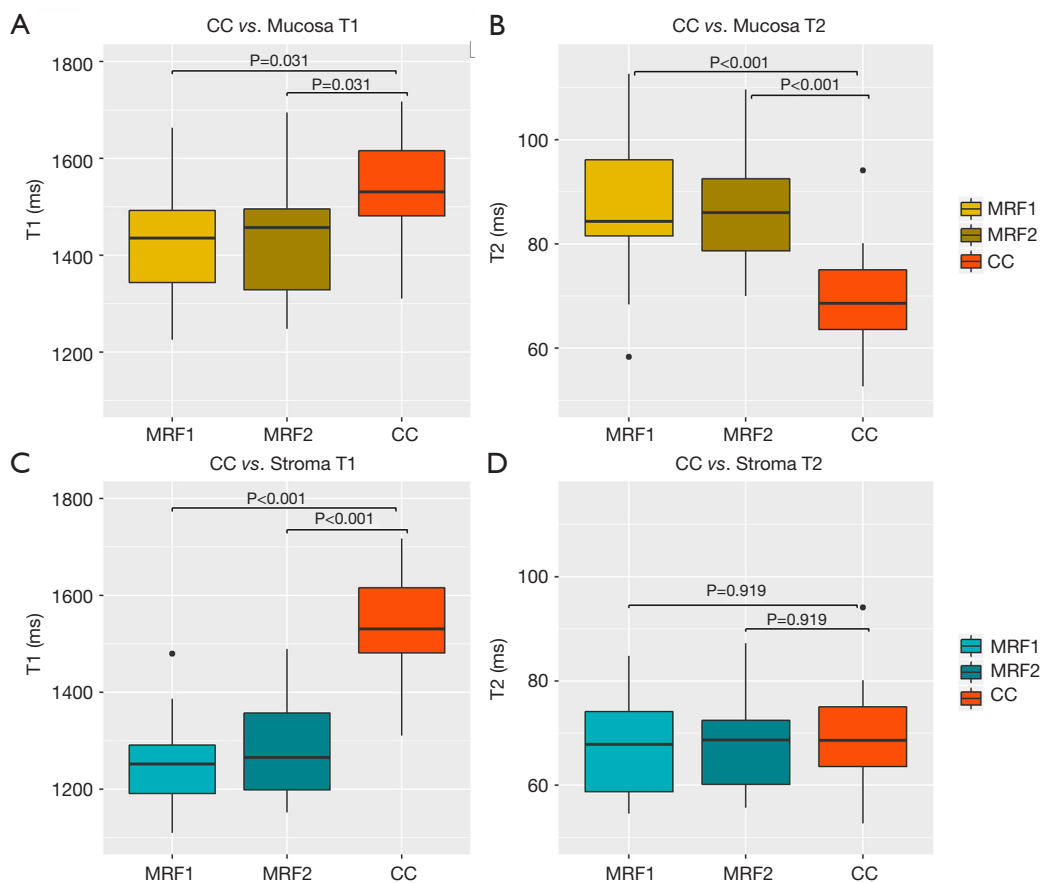


Figure 7 The box whisker plots of the T1 and T2 values of CC and normal cervical tissues. The top row shows CC in comparison with mucosa (A) T1 and (B) T2 values while the bottom row shows CC in comparison with stroma (C) T1 and (D) T2 values. CC, cervical carcinoma; MRF, magnetic resonance fingerprinting.

of fluid flow across the bladder renders the estimation of relaxation times in this region unreliable. Third, scan-rescan repeatability was only conducted on healthy volunteers; further investigation of scan-rescan for patients will be needed. Fourth, the interval between scan-rescan may not be sufficient in a clinical scenario. However, there have been previous MRF studies that used the same length interval (4,10); more clinically appropriate time intervals will be explored in follow-up studies. Fifth, all the MRF sequences were conducted on a single 3T MRI scanner, reproducibility of MRF for cervical imaging on multiple scanners would be necessary to evaluate the transferability to other MRI units and vendors in the future. Sixth, the sample sizes of both patients and healthy volunteers were limited, larger cohorts would be needed to validate our results. Lastly, patients with both SCC and ACA were recruited and the healthy volunteers were not age-matched to the patients with CC,

both these factors and variabilities may further confound our results due to the inhomogeneity of the data.

Conclusions

Our study demonstrated that the agreement of MRF with reference in phantom, scan-rescan repeatability of MRF in normal cervix were excellent, and T1 and T2 values from MRF could differentiate CC from normal cervical tissues.

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Footnote

Conflicts of Interest: All authors have completed the ICMJE

uniform disclosure form (available at <http://dx.doi.org/10.21037/qims-20-1382>). The authors have no conflicts of interest to declare.

Ethical Statement: The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). The study was approved by Institutional Review Board of The University of Hong Kong/Hospital Authority Hong Kong West Cluster (HKU/HA HKWC IRB), IRB Reference No. UW 19-683. Informed consent was taken from all individual participants.

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