

Gastrointestinal 4D MRI with respiratory motion correction

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(Received 15 August 2020; revised 12 January 2021; accepted for publication 29 January 2021; published 24 March 2021)

Purpose: Gastrointestinal motion patterns such as peristalsis and segmental contractions can alter the shape and position of the stomach and intestines with respect to other irradiated organs during radiation therapy. Unfortunately, these deformations are concealed by conventional four-dimensional (4D)-MRI techniques, which were developed to visualize respiratory motion by binning acquired data into respiratory motion states without considering the phases of GI motion. We present a method to reconstruct breathing-compensated images showing the phases of periodic gastric motion and study the effect of this motion on regional anatomical structures.

Methods: Sixty-seven DCE-MRI examinations were performed on patients undergoing MRI simulation for hepatocellular carcinoma using a golden-angle stack-of-stars sequence that collected 2000 radial spokes over 5 min. The collected data were reconstructed using a method with integrated respiratory motion correction into a time series of 3D image volumes without visible breathing motion. From this series, a gastric motion signal was extracted by temporal filtering of time-intensity curves in the stomach. Using this motion signal, breathing-corrected back-projection images were sorted according to the gastric phase and reconstructed into 21 gastric motion state images showing the phases of gastric motion.

Results: Reconstructed image volumes showed gastric motion states clearly with no visible breathing motion or related artifacts. The mean frequency of the gastric motion signal was 3 cycles/min with a standard deviation of 0.27 cycles/min.

Conclusions: Periodic gastrointestinal motion can be visualized without confounding respiratory motion using the presented GI 4D MRI technique. GI 4D MRIs may help define internal target volumes for treatment planning, aid in planning organ at risk volume definition, or support motion model development for gastrointestinal motion tracking algorithms for real-time MR-guided radiation therapy. © 2021 American Association of Physicists in Medicine [<https://doi.org/10.1002/mp.14786>]

Key words: 4D MRI, abdomen, deformable image registration, gastrointestinal, motion correction, motion correction, MRI

Abbreviations

4D MRI	four-dimensional MRI
DCE MRI	dynamic contrast-enhanced MRI
FOV	field of view
GI	gastrointestinal
GTV	gross tumor volume
MR	magnetic resonance
PC	principal component
PCA	principal component analysis
VIBE	volume-interpolated breathhold examination
VOI	volume of interest

1. INTRODUCTION

Combined magnetic resonance imaging (MRI) and external beam radiation therapy (“MR Linac”) systems are rapidly expanding in clinical use.^{1,2} These systems have already demonstrated significant advantages in efficiently gating precision radiation therapy treatments for breathing motion due to both their improved contrast over radiographic image guidance systems as well as their ability to constantly monitor the patient while treatment is being delivered. Early prototype systems have further demonstrated the ability to

opportunistically take advantage of day-to-day variations in abdominal configuration to adapt abdominal radiation therapy treatments as needed based on imaging immediately prior to treatments,³⁻⁷ with promising initial results for pancreatic cancer.⁸⁻¹²

While these nascent applications of configuration and (breathing) motion monitoring have already demonstrated benefit, the influence of less prominent anatomic motions, which may further limit safe delivery of tomuricidal doses, have yet to be managed effectively. The effect of gastrointestinal (GI) motion during radiotherapy has been studied using 4D CT¹³ and fluoroscopy,¹⁴ with both investigations demonstrating that intrafractional gastrointestinal motion is of potentially significant magnitude to impact tumor and/or normal tissue delivered doses, and is not correlated with ventilatory motion. Aside from CT and fluoroscopy, gastrointestinal motion has also been studied using cine MRI.¹⁵⁻¹⁹ These investigations, while informative, fall short of full characterization of GI motions for individual patients in support of planning and/or active monitoring of treatments.

We have previously developed techniques to image dynamic changes in the abdomen free of confounding respiratory motion.^{20,21} In this study, we present a method for four-dimensional (4D) imaging of periodic gastric motion and employ this method to study motion patterns of the stomach during MR simulation for radiation therapy.

2. MATERIALS AND METHODS

2.A. Imaging

Under an institutional review board approved protocol, 67 MRI examinations from 32 patients (11 women; 20 men; 48–78 years old; 1–3 examinations per patient) were performed as part of a study of adaptive radiation therapy for hepatocellular carcinoma. Patients were asked not to eat anything for 2 hrs before their MRI scans. A 3-T MRI scanner (Magnetom Skyra, Siemens Healthineers, Erlangen, Germany) was used with an 18-channel flexible surface coil (BodyMatrix) and 2–

TABLE I. DCE-MRI sequence parameters.

Sequence parameters	
Sequence type	Golden-angle stack-of-stars spoiledgradient echo with fat suppression
Echo time	1.14–1.21 ms
Repetition time	2.72–4.51 ms
Flip angle	10°–14°
Image matrix size	192 × 192
Number of slices	64
Number of partitions	46 (acquired) + 12 (partial Fourier)
Number of radial spokes	2000
In-plane voxel size	2–2.45 mm
Slice thickness	3–4 mm

5 elements of the posterior coils build into the scanner table (Spine Matrix). Raw dynamic MRI data in k-space were acquired with a golden-angle stack-of-stars sequence (Radial VIBE) for 5 min as part of a scan protocol designed to assess liver function using DCE MRI.²²⁻²⁴ Sequence parameters are given in Table I. Aside from the liver, the field of view (FOV) also covered the stomach as well as a large part of the intestines.

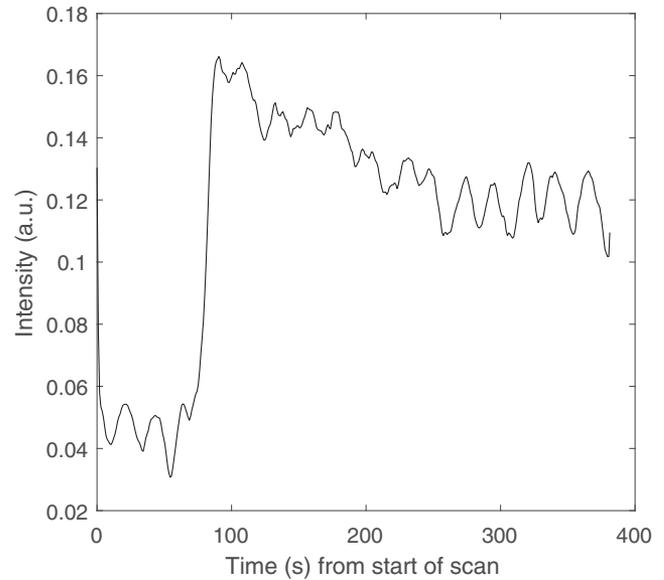


FIG. 1. Sample time-intensity curve for a single voxel inside a stomach volume of interest for one patient. The oscillations in the curve are due to periodic gastric motion. The large intensity increase one minute into the scan is caused by the contrast agent (Gd-BOPTA) injection.

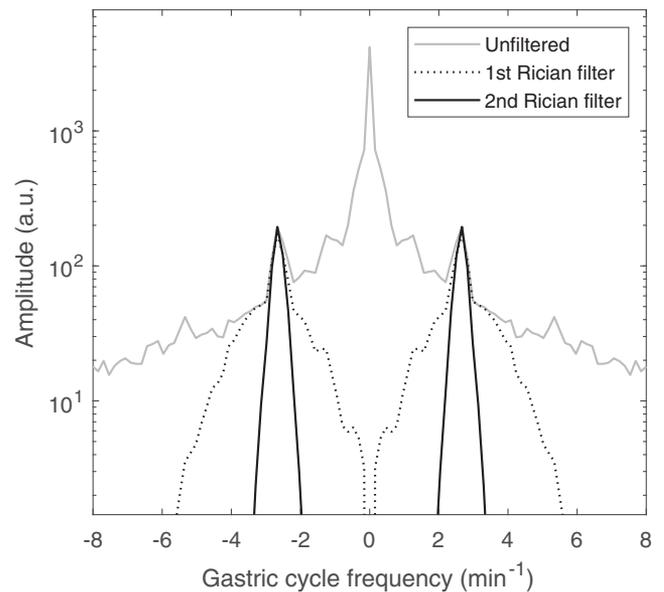


FIG. 2. Total power spectrum of gastric time-intensity curves before filtering (solid gray) and after application of the first (dotted black) and second (solid black) Rician filters. The filters select the two peaks corresponding to periodic gastric motion.

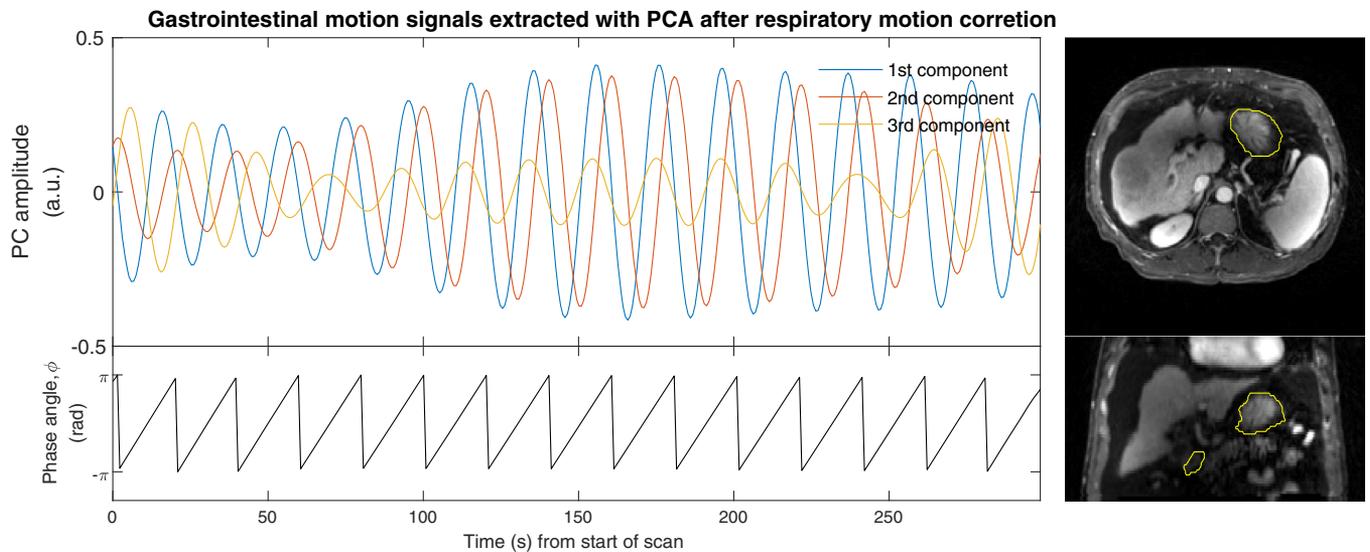


FIG. 3. The first three PCs extracted from filtered time–intensity curves within a volume of interest encompassing the stomach (yellow contours on right). The gastric motion signal, ϕ , is defined as the phase of the first PC. [Color figure can be viewed at wileyonlinelibrary.com]

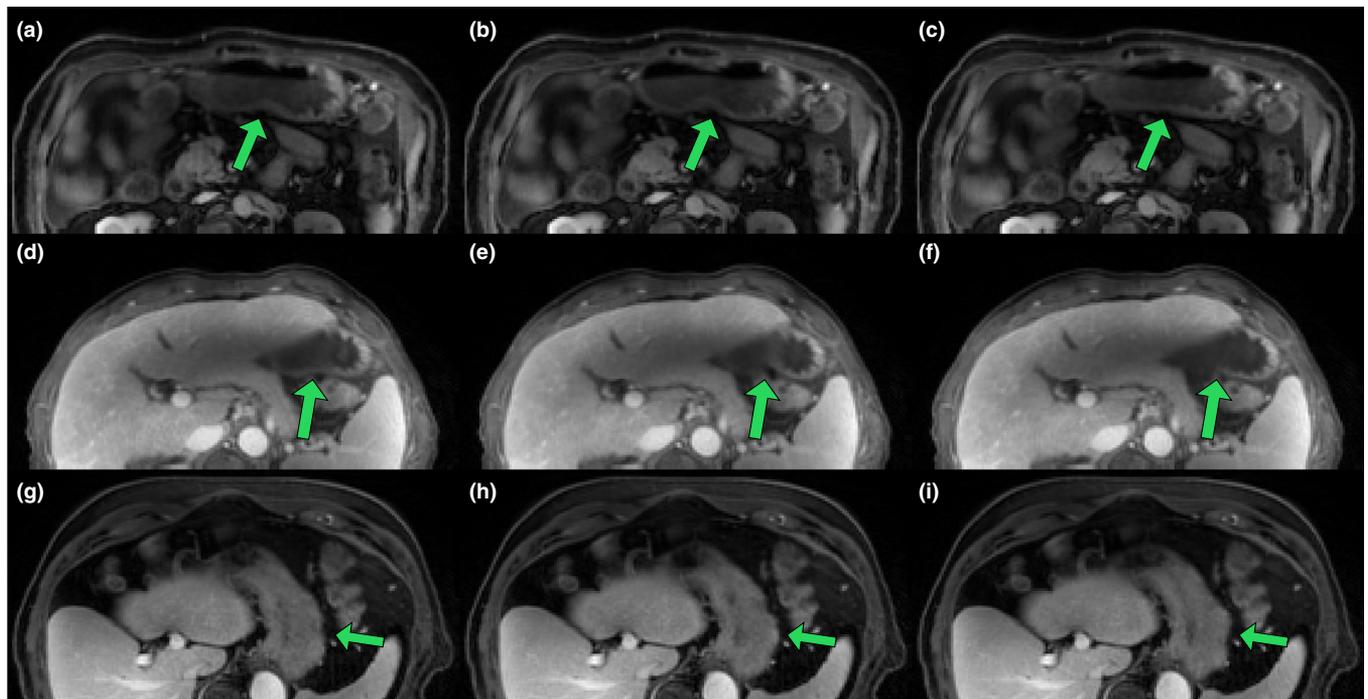


FIG. 4. Three phases of a periodic gastric motion cycle from three separate patients. Each phase is shown in planes through the lower abdomen (a, b, c) for patient 1, liver lateral tip (d, e, f) for patient 2, and inferior liver and spleen (g, h, i) for patient 3. Green arrows indicate large stomach tissue movements. Movies of the three patients are available as supplemental materials Video S1–S3. [Color figure can be viewed at wileyonlinelibrary.com]

2.B. Respiratory motion correction

Acquired raw data were reconstructed into a time series of three-dimensional images without visible respiratory motion using a previously described technique for DCE-MRI 4D reconstruction with respiratory motion correction.²¹ The technique first extracts a respiratory motion signal from the superior–inferior motion of the liver dome in an image time series reconstructed with high temporal but low spatial resolution from the stack-of-stars data. Acquired radial spokes are then

sorted from exhale to inhale and reconstructed using view-sharing into a respiratory 4D MRI. A respiratory motion model is constructed by deformably aligning the breathing phases of the respiratory 4D MRI to the exhale phase and then parameterizing the resulting set of deformation vector fields by the motion signal. Finally, the breathing-compensated dynamic time series is reconstructed by deforming back-projections of individual radial spokes from the stack-of-stars sequence to the exhale state using interpolated deformation vector fields from the respiratory motion model and

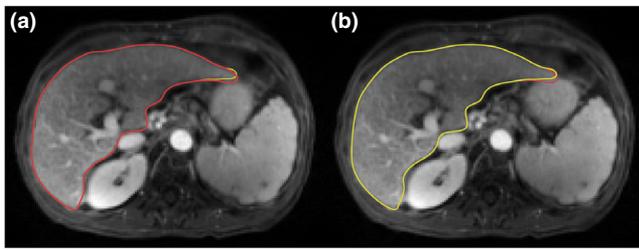


FIG. 5. The largest observed liver deformation (6 mm) caused by periodic gastric motion. Two phases are shown, half a gastric cycle apart. The red contour shows the shape of the liver in (a) and the yellow contour the shape in (b). [Color figure can be viewed at wileyonlinelibrary.com]

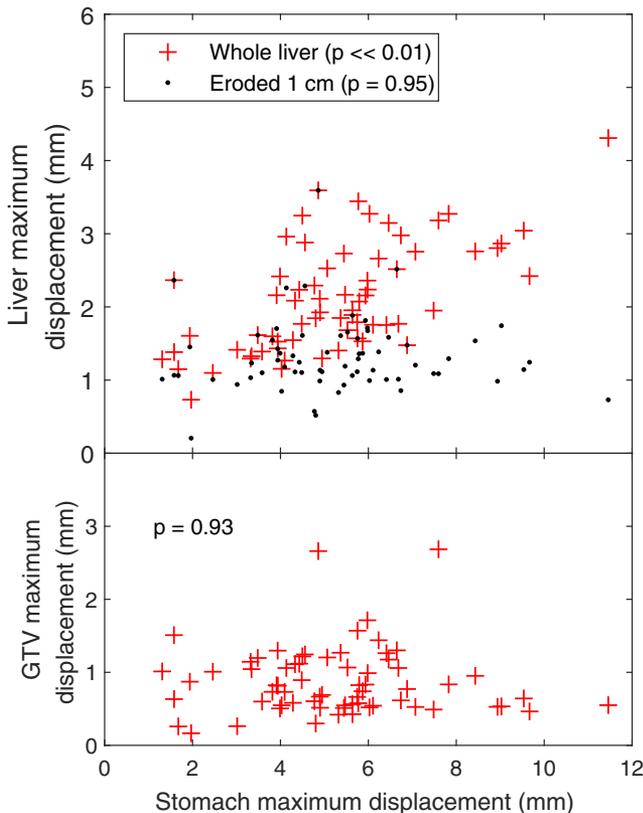


FIG. 6. Maximum displacements over the gastric cycle for the stomach versus the liver (top) and the intrahepatic gross tumor volume (bottom). [Color figure can be viewed at wileyonlinelibrary.com]

then combining the deformed back-projections into a time series using temporal view sharing. The temporal resolution of the view-sharing filter was 2 s at the center, and 58 s at the periphery, of k-space.

2.C. Periodic gastric motion signal

A volume of interest (VOI) encompassing the stomach was delineated manually for each examination on one of the dynamic 3D images. For each voxel in the VOI, a time-intensity curve (Fig. 1) was extracted from the motion corrected image time-series. These curves exhibit oscillations due to stomach motion but also a rapid increase in intensity following contrast-agent injection. The extracted time-intensity

curves were temporally filtered using a Rician filter with non-centrality parameter $\nu = 3 \text{ min}^{-1}$ and scale parameter $\sigma = 1 \text{ min}^{-1}$ to eliminate the effect on contrast agent dynamics and to emphasize gastric motion patterns which typically have a frequency of approximately 3 min^{-1} .²⁵ A total power spectrum was then formed by summing the power spectra of the individual curves (Fig. 2). The mode frequency in this power spectrum was used as the non-centrality parameter for a new Rician temporal filter with scale parameter 0.25 min^{-1} that was applied to the original time-intensity curves. A single curve was extracted as the first principal component (PC) of all the filtered curves as shown in Fig. 3. The gastric motion signal was then determined as $\varphi = \text{atan2}(y, x)$ where x is the first PC and y its derivative. Because the gastric motion that we sought to isolate can be described as a contraction wave travelling along the stomach,^{26,27} φ describes the position of this wave.

2.D. Gastric 4D MRI

To reconstruct the gastric 4D MRI, the motion-corrected back-projections of individual spokes were sorted according to their gastric cycle phase as indicated by φ . After sorting, the back-projections were combined using view sharing along the gastric dimension using a view-sharing filter²¹ with a width of 200 spokes at the center and 400 spokes at the periphery of k-space.

2.E. Evaluation

The amplitude and frequency of gastric contractions was determined using the reconstructed gastric 4D MRI and the gastric motion signal. Effects of gastric motion on the stomach, liver, intrahepatic gross tumor volume (GTV) and spleen were determined using deformable image alignment of the phases of the gastric 4D MRI. This alignment was performed using open source deformable alignment software (NiftyReg) with registration parameters identical to those reported in Ref. [21].

3. RESULTS

Contoured stomachs had volumes between 90 and 1100 ml with a mean of 330 ml. Gastric 4D MRIs showing periodic motion were successfully reconstructed for 61 of 67 examinations. For the remaining six examinations, the stomach exhibited either irregular motion patterns (four examinations), or no motion at all (two examinations). The frequency of periodic gastric motion varied among the 61 examinations from 2.5 to 3.8 min^{-1} with a mean of 3 min^{-1} and standard deviation of 0.27 min^{-1} . For the irregular motion patterns, the average mode frequency was 3 min^{-1} . Reconstructed gastric motion phase images presented with minimal motion-related artifacts, and clearly demonstrated changing configurations consistent with cyclic motions such as gastric contraction (Fig. 4 and supplemental Video S1–S3).

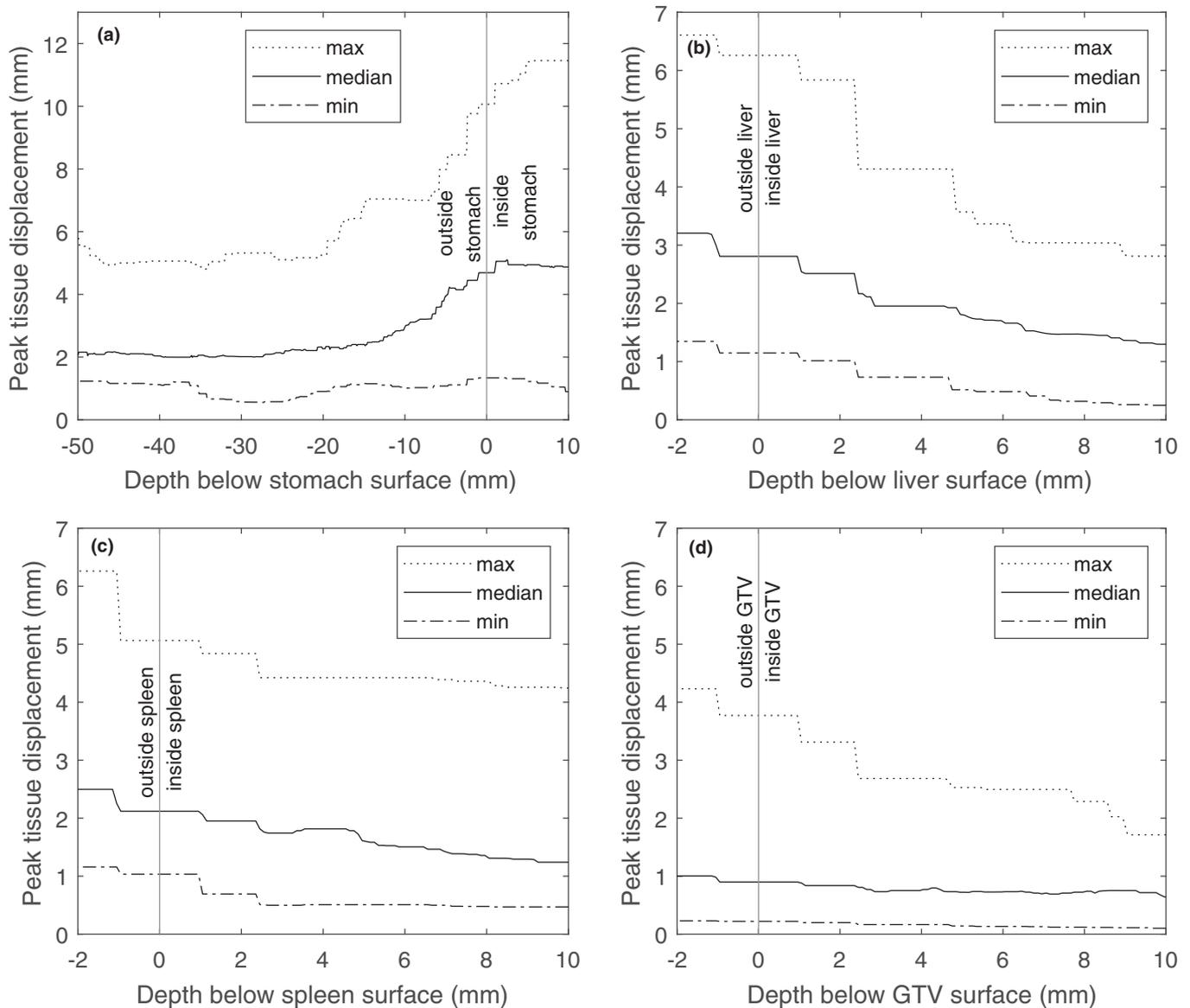


FIG. 7. Peak GI-induced displacements of locations inside the stomach (a), liver (b), spleen (c), and liver gross tumor volume (d) vs the depth of the locations below the structure surfaces. Negative depths represent locations outside the structures. The dotted, solid, and dashed lines show the maximum, median and minimum peak displacements across all patients.

Maximum displacements in the stomach caused by gastric motion had a mean of 5 mm and a maximum of 12 mm across examinations. Maximum displacements in the liver had a mean of 3.6 mm and a maximum of 6 mm (Fig. 5) whereas the spleen had a mean displacement of 2.3 mm and a maximum of 5 mm.

Maximum displacements in the liver were significantly correlated (Pearson correlation test, $P \ll 0.01$) to the maximum displacement in the stomach across patients as seen in Fig. 6. However, this correlation was localized to the liver periphery and was not observed ($P = 0.95$) for a subvolume defined by a 10 mm erosion of the liver VOI. No significant correlation ($P = 0.93$) of maximum stomach displacement and maximum intrahepatic GTV displacement was found for treated targets located in the liver from this patient population.

For the whole liver, spleen, and liver GTVs, maximum displacements were found at the surface of the organs (Fig. 7) with smaller displacements inside the organs and larger displacements outside. For the stomach, the largest displacements occurred inside the organ with displacements of surrounding structures declining with the increasing distance to the stomach.

Stomach volumes at the first and second scan were similar for most patients [Fig. 8(a)] as were the gastric cycle frequencies. For the few patients with large changes in stomach volume, filling did not have an obvious effect on the observed gastric cycle frequency [Fig 8(b)].

Because 91% of the examinations exhibited periodic gastric motion consistent with antral contraction, we conclude that this is the dominant mode of gastric motion for our

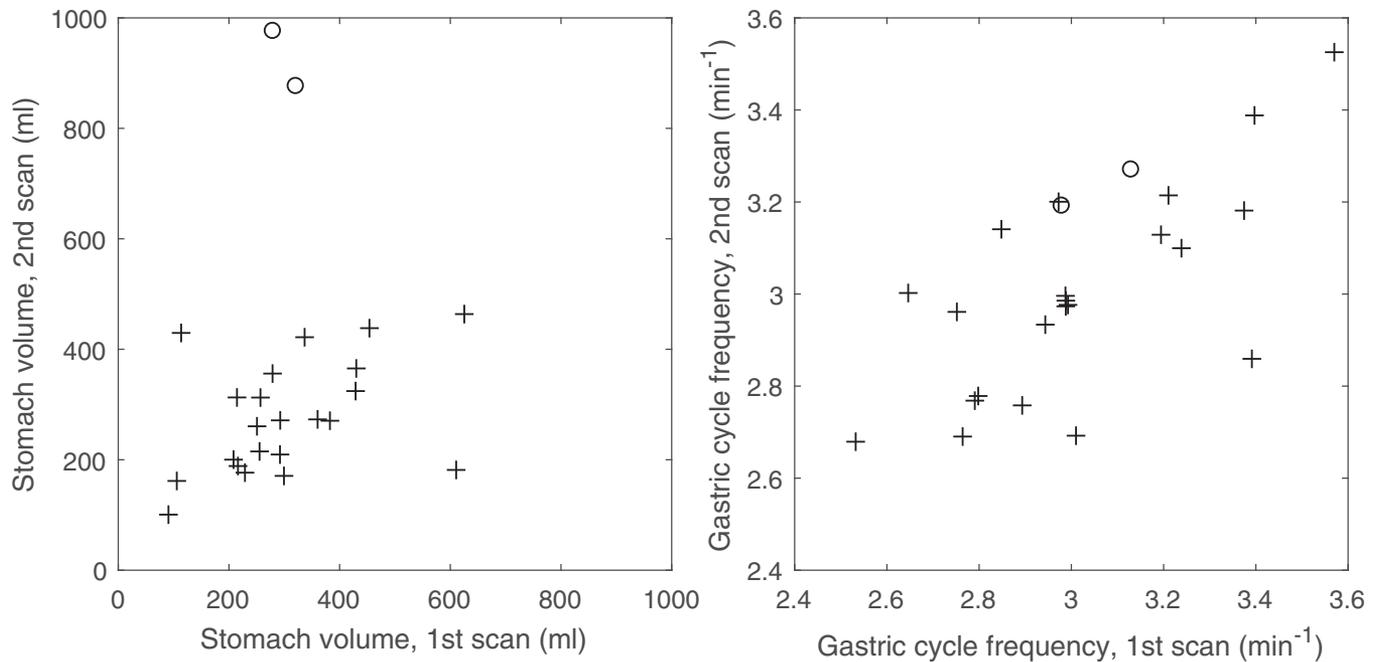


FIG. 8. Interfractional changes of stomach volume and gastric cycle frequencies. Circles indicate patients whose stomach volumes changed by more than 500 ml between scans.

population. Other modes, such as non-periodic motion and quiescence were much less frequent (6% and 3% respectively).

4. DISCUSSION

Despite large periodic gastric movements, the non-GI organs surrounding the stomach exhibit only minor movements after respiratory motion correction. With respect to periodic gastric movements, the GI tract appears almost decoupled from its surrounding. This may be a consequence of the relative stiffness of, for example, the liver to that of the stomach and intestines. Unlike the liver, GI organs close to the stomach, were observed to move in sync with the gastric cycle due to the forces exerted on them by stomach contractions.

The maximum displacements induced in surrounding structures by periodic gastric motion drop rapidly with the distance to the stomach, from a maximum of 6 mm at the stomach surface to a stationary plateau at a 20-mm distance. At this distance, the maximum displacement is dominated by the maximum registration error for all patients.

The predominantly periodic gastric motion observed in our population may have been a result of the patients not eating 2 hr prior to the MRI simulation. Therefore, patients may need to follow the same instructions prior to each radiation therapy treatment session for the GI 4D MRI to be representative. Other instructions may result in different relative frequencies of gastric motion modes with periodic motion, non-periodic motion, or quiescence.

For the few patients observed with non-periodic gastric motion, the presented GI 4D MRI technique is not applicable. To image this motion, fast dynamic 3D imaging

techniques, possibly accelerated by compressed sensing or artificial intelligence, need to be developed.

The large inter-examination changes in stomach volume observed for two patients were likely caused by the patients not following the no-eating instructions before the second scan. For these patients, stomach filling did not affect the gastric cycle frequency.

The presented method requires manual delineation of a stomach VOI to extract the GI motion signal. This delineation need not be precise. It is enough for the VOI to cover the stomach with a margin. Eliminating this manual step would allow a GI 4D MRI to be reconstructed without operator intervention after scanning. For this purpose, automatic stomach segmentation driven by deep learning could be used in future studies.

This investigation provides a general framework for investigation of gastrointestinal motions in the abdomen. While the focus of the initial investigation was related to motions of the stomach and their impact on surrounding anatomic configurations, the methodology presented herein could be applied to further explore motion as well as longer term configuration changes of the abdomen at locations distal to the stomach.

Tissue displacements due to GI motions are often smaller in amplitude than displacements caused by breathing. Determining margins for target volumes or organs at risk from the GI 4D MRI alone is not meaningful. Instead, the movements observed in the GI 4D MRI could be modelled and composed with the previously constructed respiratory motion model²¹ into a combined respiratory and gastrointestinal motion model. From this model, patient-specific margin or population margins could be estimated. The model could also help guide gating or tracking²⁸ during irradiation for MR-guided radiation therapy with MR-linacs.

5. CONCLUSIONS

Periodic gastrointestinal motion can be visualized without confounding respiratory motion using the presented GI 4D MRI technique. Periodic gastric motion can cause tissue displacements of up to 10 mm for other GI organs. The effect on other surrounding organs such as liver and spleen is smaller with a maximum observed displacement of 6 mm.

ACKNOWLEDGMENTS

This work was supported by NIH/NCI P01 CA059827 and NIH/NIBIB R01 EB016079. The prototype Radial VIBE sequence was provided by Siemens Healthineers under a research agreement.

CONFLICTS OF INTEREST

The authors have no conflicts to disclose.

DATA AVAILABILITY STATEMENT

Raw data were generated at the University of Michigan. Derived results from the data that support this study can be accessed from the corresponding author upon request.

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SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section at the end of the article.

Video S1. Gastric motion for the patient shown in Fig. 4(a–c).

Video S2. Gastric motion for the patient shown in Fig. 4(d–f).

Video S3. Gastric motion for the patient shown in Fig. 4(g–i).