

# Low Rank Motion Correction for IVIM and Diffusion Spectrum Quantification for Indeterminate Renal Masses

**Primary:** Diffusion - IVIM ) **Secondary:** Body - Kidney ) **Oral** · 11 min | [Inside the Bean: Advances in Renal MRI](#) · Tuesday, 12 May, 9:04 AM–9:15 AM · Session: 8:20–10:10 AM · Hall 1B ) **Keywords:** KIDNEY IVIM MOTION CORRECTION APPARENT DIFFUSION COEFFICIENT LOW RANK

**Ningjun Wang** <sup>1</sup>, **Michael J Jaroszewicz**<sup>1</sup>, **Yun Jiang**<sup>1,2</sup>, **Zhengguo Tan**<sup>1</sup>, **Jesse Hamilton**<sup>1,2</sup>, **Vikas Gulani**<sup>1</sup>, **Hero K Hussain**<sup>1</sup>, **Matthew Davenport**<sup>1,3</sup>, **Nicole Seiberlich**<sup>1,2</sup>, **Gastao Cruz**<sup>1</sup>

<sup>1</sup>Department of Radiology, University of Michigan, Ann Arbor, United States of America

<sup>2</sup>Department of Biomedical Engineering, University of Michigan, Ann Arbor, United States of America

<sup>3</sup>Department of Urology, University of Michigan, Ann Arbor, United States of America

 **Presenting Author:** Ningjun Wang ([wunjacky@umich.edu](mailto:wunjacky@umich.edu))

## Impact

IVIM and diffusion spectrum quantification using a fast free-breathing diffusion EPI protocol is feasible in healthy subjects and renal mass patients. This type of quantitative diffusion data could help in the characterization of indeterminate renal masses.

## Synopsis

**Motivation:** IVIM and diffusion spectrum quantification have the potential to characterize kidney tissue. However, they require images with different b-values, typically acquired free-breathing, making them motion-sensitive and prone to noise/aliasing.

**Goals:** Investigate the feasibility of IVIM and diffusion spectrum quantification in indeterminate renal masses using a novel Low Rank Motion Corrected reconstruction.

**Approach:** Multi-slice, single-shot EPI with 50 b-values was acquired free-breathing and reconstructed with LRMCH-DP to fit ADC, IVIM and diffusion spectrum.

**Results:** Compared to SENSE, LRMCH-DP reduced motion artefacts/noise in IVIM maps and provided more stable diffusion spectra, consistent with ADC and IVIM findings. Results show distinct spectra in different renal tissues.

## Introduction

Indeterminate renal masses are clinically assessed with a combination of pre-contrast T2-weighted, pre-/post-contrast T1-weighted, and diffusion-weighted (including Apparent Diffusion Coefficient, ADC) imaging. Intra-voxel incoherent-motion (IVIM)<sup>1</sup> considers a bi-exponential model, capable of measuring both diffusion (D) and perfusion (D\*), as well as the fraction between them (PF), and has been used to grade clear cell renal cell carcinoma.<sup>2</sup> The complementary information from other multi-exponential diffusion models has also been used to characterize solid renal masses,<sup>3</sup> suggesting that further diagnostic information may be found in the full quantitative diffusion spectrum. However, mapping the diffusion spectrum requires a large number of b-value data, and consequently accelerated, free-breathing protocols. In this study, we present a free-breathing, low-rank, motion-corrected reconstruction framework and investigate its feasibility of quantifying ADC, IVIM, and spectral diffusion in renal masses.

## Methods

Diffusion data were acquired with multi-slice, single-shot free-breathing EPI. Low Rank Motion Correction (LRMC)<sup>4</sup> was combined with Virtual Coil Concept (VCC)<sup>5</sup> and Dictionary-Patch based regularization (DP)<sup>6</sup> to perform respiratory motion correction and suppress residual aliasing/noise artefacts ([Fig. 1](#)). First, a preliminary SENSE<sup>7</sup> reconstruction was performed to estimate image phase, voxel-wise low rank subspaces of diffusion via SVD of local Casorati matrices, and respiratory motion via image registration using NiftyReg<sup>8,9</sup>. Secondly, data were reconstructed using LRMCH-DP as shown in [Fig. 1](#). Finally, reconstructed data were fitted using i) a single exponential fit for ADC, ii) a bi-exponential fit for IVIM<sup>12</sup> (diffusion D, perfusion D\* and perfusion fraction PF) and iii) sparse non-negative least squares fit to map the full diffusion spectrum G(D). An in-house built diffusion phantom, three healthy subjects and four patients referred for indeterminate renal masses were scanned at 1.5T (Magnetom Sola, Siemens Healthineers, Erlangen, Germany) with a free-breathing, multi-slice single-shot EPI. Imaging settings included: FOV=400x400 mm<sup>2</sup>; resolution=1.6x1.6 mm<sup>2</sup>; TE/TR=105/8700 ms; 5/8 Partial Fourier; 20 slices; 50 b-values with 30 b-values between [0 – 200] s/mm<sup>2</sup> and 20 b-values between [200 – 1400] s/mm<sup>2</sup>; ~8-minute scan time. Data was reconstructed using SENSE and LRMCH-DP, and fitted for ADC, IVIM and diffusion spectrum. Regions of interest were delineated on the renal cortex and medulla for all subjects and renal masses in patients to calculate the mean and standard deviation for ADC, D, D\*, and PF.

## Results

The proposed approach was validated on a phantom, where fitted ADC values showed excellent linear correlation with a R<sup>2</sup>~0.99 with ground-truth values ([Fig. 2a](#)). Multiple cysts with high D (2.86x10<sup>-3</sup>) and negligible PF (~0%) were observed, as well as a Bosniak IV with lower D (1.63x10<sup>-3</sup>) and higher D\* (1.50x10<sup>-2</sup>) and PF (32%) in its solid component in patient 1 ([Fig. 2b](#) and [Fig. 3](#)). Motion and misalignment between b-value images produce motion artefacts in the SENSE D, D\* and PF maps, causing a cyst to be mismapped ([Fig. 3](#), patient 2); these are reduced with the proposed approach. Diffusion spectrum G(D) quantification was in agreement with ADC and IVIM measurements. This analysis revealed different spectra in cortex, medulla, and Bosniak IV (cystic/solid components) ([Fig. 4](#)). G(D) in kidney parenchyma was in general agreement with previous literature; higher perfusion peaks were observed in the Bosniak IV component, as expected due to its vascularization<sup>13</sup>. The ADC/IVIM measurements were in agreement with literature values<sup>14</sup>, and reduced aliasing in LRMCH-DP yielded lower standard deviations relative to SENSE for all diffusion parameters ([Fig. 2b](#)). The cumulative diffusion spectrum is shown in [Fig. 5](#), depicting the accrued diffusion along G(D). Slow diffusion is present in both renal parenchyma and Bosniak IV (solid), followed by slightly faster diffusion occurring in cysts, and finally fast perfusion in the Bosniak IV (solid) and highly vascular regions of the renal parenchyma.

## Discussion

Preliminary results indicate that the proposed LRMCH-DP method suppresses noise and motion artefacts present in conventional SENSE reconstructions, ensuring better quality data prior to model fitting in quantitative diffusion. The main slow component of the diffusion spectrum is highly consistent with the fitted D value, although some differences were observed in the measured PFs. Distinct spectra were observed in different renal masses. While these in vivo patient findings are preliminary, they represent a promising step and suggest the potential of this technique for clinical renal mass characterization.

## Conclusion

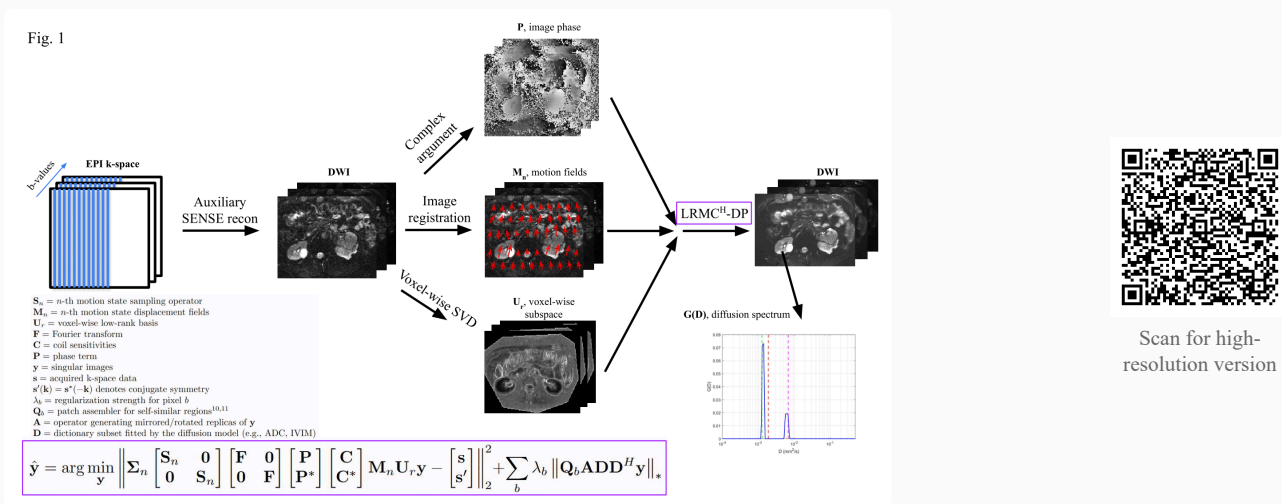
We demonstrated a robust LRMC<sup>H</sup>-DP framework for feasible, free-breathing, motion-corrected quantitative diffusion mapping. Using this method, diffusion spectrum quantification was shown to be in agreement with IVIM and ADC measurements and was capable of revealing distinct diffusion profiles in Bosniak IV renal masses.

## Acknowledgements

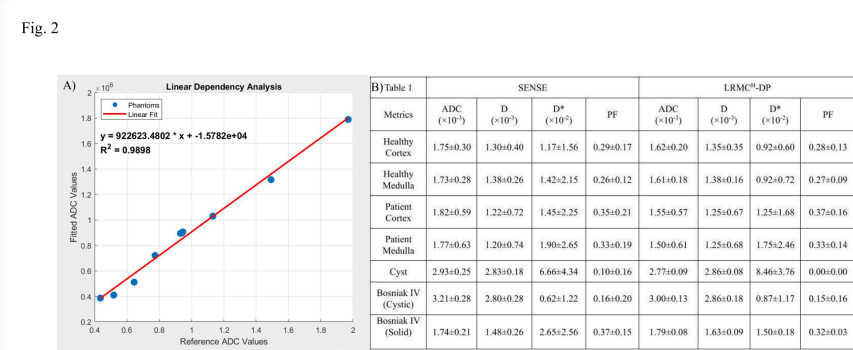
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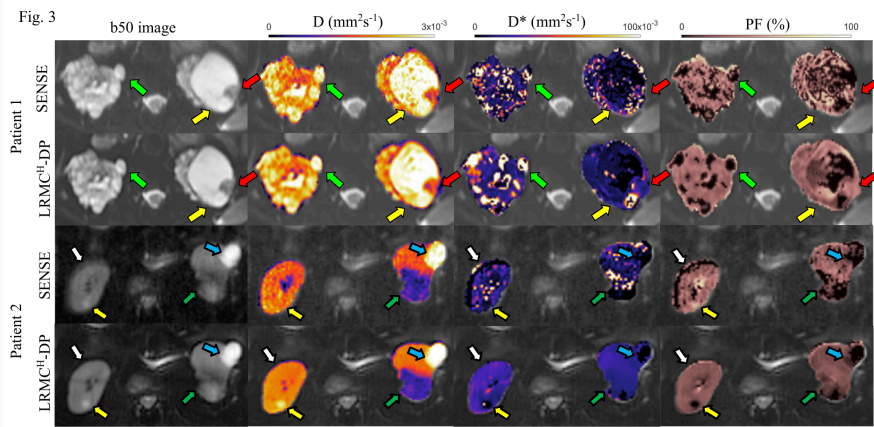
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**Figure 1:** Figure 1. Framework for the proposed  $LRMCH$ -DP reconstruction. Initial DWIs from a preliminary SENSE reconstruction are processed to estimate voxel-wise low-rank subspaces ( $U_n$ ) and motion fields ( $M_n$ ). These components, along with image phase ( $P$ ), are incorporated into the  $LRMCH$ -DP optimization (formula shown) to yield the final motion-corrected DWI, from which the diffusion spectrum  $G(D)$  is derived.

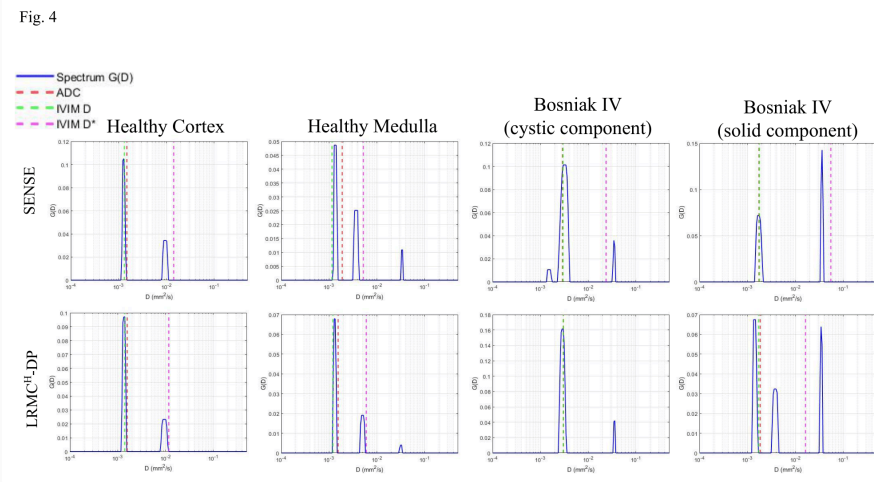


**Figure 2:** Figure 2. Quantitative validation of the  $LRMCH$ -DP method. A) Linear dependency plot shows high accuracy ( $R^2=0.9898$ ) between fitted ADC values and ground-truth reference values in a diffusion phantom. B) Table 1 compares IVIM parameters from SENSE and  $LRMCH$ -DP in tissues, which values agree with literature.  $LRMCH$ -DP shows lower standard deviations, indicating improved fitting stability.



Scan for high-resolution version

**Figure 3:** Figure 3. LRMCH-DP and SENSE reconstructions of IVIM parameter maps ( $b50$ ,  $D$ ,  $D^*$ ,  $PF$ ) in two patients referred for indeterminate renal masses. The LRMCH-DP method demonstrates reduced noise and greater homogeneity. Arrow key: (Patient 1) green=cyst, yellow=cystic component (Bosniak IV), red=solid compartment; (Patient 2) yellow=cyst, blue=Bosniak II, green=hematoma.



Scan for high-resolution version

**Figure 4:** Figure 4. Diffusion spectra for healthy kidney and renal mass tissues using SENSE vs. LRMCH-DP. LRMCH-DP demonstrates more stable and better-fitted peaks across all tissues, including the Bosniak IV mass. Reference lines: ADC (red), IVIM  $D$  (green), and  $D^*$  (pink).

▶ **Animated Figure 5**

This figure contains animation/video content. To view the animation, scan the QR code with your mobile device or visit the online version of this abstract.



**Figure 5:** *Figure 5. Visualization of the cumulative  $G(D)$  in two representative kidney slices. This metric is the cumulative sum of the diffusion spectrum  $G(D)$  components up to the  $D$ -value ( $x$ -axis). The image shows signal build-up, where increases in brightness correspond to diffusion peaks, showing how the signal builds up from slow to fast diffusion in different tissues. For example, cysts show one main jump, while Bosniak IV solid components show their main jump at higher  $D$ -values.*