

## Three-dimensional, isotropic imaging of mouse brain using multi-view deconvolution light sheet microscopy

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We present a three-dimensional (3D) isotropic imaging of mouse brain using light-sheet fluorescent microscopy (LSFM) in conjunction with a multi-view imaging computation. Unlike common single view LSFM is used for mouse brain imaging, the brain tissue is 3D imaged under eight views in our study, by a home-built selective plane illumination microscopy (SPIM). An output image containing complete structural information as well as significantly improved resolution ( $\sim 4$  times) are then computed based on these eight views of data, using a bead-guided multi-view registration and deconvolution. With superior imaging quality, the astrocyte and pyramidal neurons together with their subcellular nerve fibers can be clearly visualized and segmented. With further including other computational methods, this study can be potentially scaled up to map the connectome of whole mouse brain with a simple light-sheet microscope.

**Keywords:** Light sheet fluorescent microscopy; multi-view deconvolution; mouse brain imaging; isotropic.

### 1. Introduction

Light sheet fluorescent microscopy (LSFM) is an emerging technology that can three-dimensionally

image various samples from cells to whole organisms with low phototoxicity and high speed.<sup>1–3</sup> LSFM is fundamentally characterized by setting a separated

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plane illumination orthogonal to the wide-field detection, thus enabling optical sectioning inside the samples with sharp contrast and high axial resolution superior to conventional microscopes.<sup>4–7</sup> In the past decade, besides the basic Gaussian light-sheet generated with a cylindrical lens, LSFM have derived a series of structural variants, including multidirectional SPIM (mSPIM), Digital Scanned Laser Light-sheet Fluorescence Microscopy (DSLIM), Bessel beam plane illumination microscopy and so on.<sup>8–14</sup> In accordance to these advanced LSFM imaging modalities, a variety of novel biomedical studies have been accomplished based on their excellent visualization.<sup>15–20</sup>

Among those applications, neural imaging of clarified mammal tissues, such as mouse brain and rat spinal cord, using LSFM tends to be a popular field that is particularly towards the high-resolution imaging under a very large field-of-view. However, LSFM is still challenging in this scenario for its axial resolution, which is typically 4 to 20  $\mu\text{m}$ , remaining insufficient for three-dimensionally visualizing the single neurons across a large interactive area.<sup>21–25</sup> Therefore, the fine neural connections are not able to be revealed as what have been achieved by micro-optical sectioning tomography (MOST) or sequential two photon excitation microscopy.<sup>26–29</sup> Furthermore, even for the optically-cleared organs, the light scattering as well as absorption still exists, largely deteriorating the quality from the depth of tissues. Several LSFM techniques have been developed to capture the sample images under four or more views, and computationally fuse them into single one with showing complete signals as well as improved resolution.<sup>30–32</sup> The multi-view LSFM has been successfully applied to image live samples,<sup>32,33</sup> such as zebrafish and *Drosophila* embryos, but not to the cleared brains or other tissues.

Here, we present the first brain imaging using SPIM in conjunction with multi-view deconvolution (MVD). Three-dimensional (3D) image stacks of the brain tissue are consecutively recorded under eight views, by rotating the sample a full circle. Then, a bead-based registration, followed by a multi-view Bayesian deconvolution are applied to the eight views of image, to reconstruct a complete visualization of brain cortex with an isotropic resolution  $\sim 1.6 \mu\text{m}$ . Benefiting from the significantly improved resolution as well as more complete signals, we can segment typical neural structures, such

as pyramidal neurons and astrocytes, in three dimensions, and with showing fine nerve fibers. In the following, we will briefly describe the experimental design and implementation of multi-view brain imaging, discuss how to apply the image computation, and demonstrate the isotropic visualization of brain neural connectivity.

## 2. Results

### 2.1. Sample preparation

To minimize the tissue scattering, chemical clearing of the mouse brain is an essential step before imaging. Here, we use an organic-solvent-based clearing method (uDISCO<sup>24</sup>) to clarify the brain of a transgenic adult mouse that is labeled with Thy1-green fluorescent protein (line M, Jackson Laboratory). The picture of cleared brain tissue is shown in supplementary figure S1 and compared to raw tissue.

The cleared brain is first embedded into transparent resin homogeneously mixed with fluorescent beads, to better preserve the sample fluorescence and reduce photobleaching during imaging.<sup>34</sup> Then, the resin packed brain is mounted onto a rotating motor immersed into a glass chamber filled with refractive index-matched solvent (benzyl alcohol + benzyl benzoate + diphenyl ether, BABB-D) for upcoming LSFM imaging (Fig. 1(b)).

### 2.2. Multi-view LSFM image of brain cortex

We carry out multi-view imaging by a simple selective plane illumination light sheet microscope (SPIM) which is constructed by ourselves (Figs. 1(a) and 1(b)). The real picture of the system is shown in supplementary Fig. S2. The size of uniform illumination range of the hyperbolic laser-sheet is proportional to the thickness of laser-sheet, which can be further tuned by an adjustable slit. In our demonstration, the axial extent (thickness at beam waist) of the laser-sheet is  $\sim 12 \mu\text{m}$ , generating a sufficiently long range to illuminate a brain cortex specimen with size around 3 by 1.5 by 1.5 mm. A 4D motorized stage can move the specimen at  $x$ - $y$  plane, scan it along  $z$  direction, and rotate it along  $y$  direction with accurate incremental angle

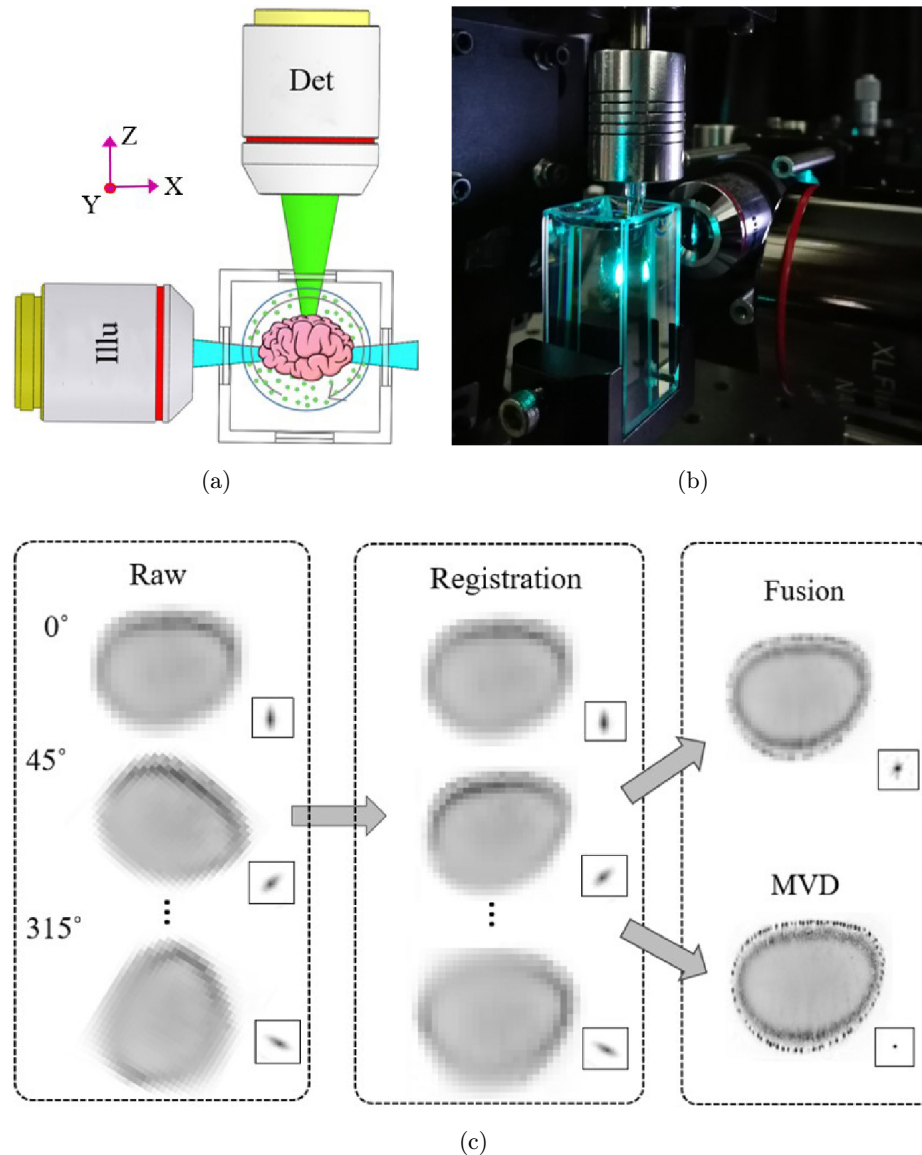


Fig. 1. Schematic of the multi-view LSFM imaging. (a) The illumination objective excites a thin plane of the brain sample using a line-focused laser-sheet. The orthogonal detection objective collects the fluorescence emission from the illuminated plane. 3D optical sectioning is accomplished by scanning the sample along  $z$ -axis. Through rotating the sample around  $y$ -axis, we then repeat the 3D imaging under multiple views. (b) Shows a photograph of real-world scene. (c) A brief flow chart showing the essential procedures of multi-view data computation.

(coordinates are shown in Fig. 1(a)). The plane-illuminated brain is 3D imaged under  $4\times$  magnification with a scanning step-size  $5\ \mu\text{m}$ , yielding one view of LSFM image with voxel size  $1.6$  by  $1.6\ \mu\text{m}$ .

Previously, we compared the result processed by different number of views, revealing that four views MVD result does really show the isotropic resolution enhancement but the eight views deconvolution result shows higher contrast and more details in 3D space (Fig. S3). In consideration of the tradeoff

between temporal and spatial resolution, eight views are the appropriate option for this experiment. Then, the sample is rotated seven times with a  $45^\circ$  incremental angle for each view of imaging. Totally eight views of 3D images are recorded for the multi-view processing.

Here, we use the bead-based registration plus Bayesian deconvolution method to register, fuse and compute an output image that can finally recover the complete sample information from all the

views. The whole image computation procedure is further illustrated as Fig. 1(c).

### 2.3. Three-dimensional visualization of the brain neurons

We extract the sub-resolution beads ( $\sim 1 \mu\text{m}$  in diameter) from the images to characterize the multi-view imaging performance. Figure 2 shows the resolved beads, which can be treated as system point spread function, in raw image (reference view, Fig. 2(a)), average fused image (Fig. 2(b)), and the final multi-view deconvolution image (Fig. 2(c)). As shown by comparison, the resolution enhancement by multi-view processing is quite obvious, especially along the axial direction ( $yz$ ,  $xz$  planes). After Bayesian deconvolution, the fusion artifacts (shown in Fig. 2(b)) further disappear with finally showing a size-reduced, isotropically-resolved sphere.

Then, we three-dimensionally visualize the brain images in Fig. 3. Three volumes containing astrocyte (I), dense pyramidal neuron (II), and sparse pyramidal neurons (III) are selected from the complete brain sample (Fig. 3(a)), and shown as magnified views of Figs. 3(b)–3(d), respectively. In contrast to the poorly-resolved neuron sub-structures in the raw single-view image (Figs. 3(b)–3(d), left), MVD image clearly shows the patterns of dendrites and axons (Figs. 3(b)–3(d), right). The achieved resolving power of MVD image originally taken by  $4\times$  objective plus  $12 \mu\text{m}$  laser-sheet is even superior to the raw LSFM image taken by a  $10\times$  objective plus  $6 \mu\text{m}$  laser-sheet (Fig. 3(b), middle). With high-quality, 3D visualization, we can further segment single neurons with displaying their subcellular nerve fibers (Fig. 3(e)-I and III). Meanwhile, two adjacent pyramidal neurons can be also separated from each other by the virtue of improved resolution (Fig. 3(e)-II).

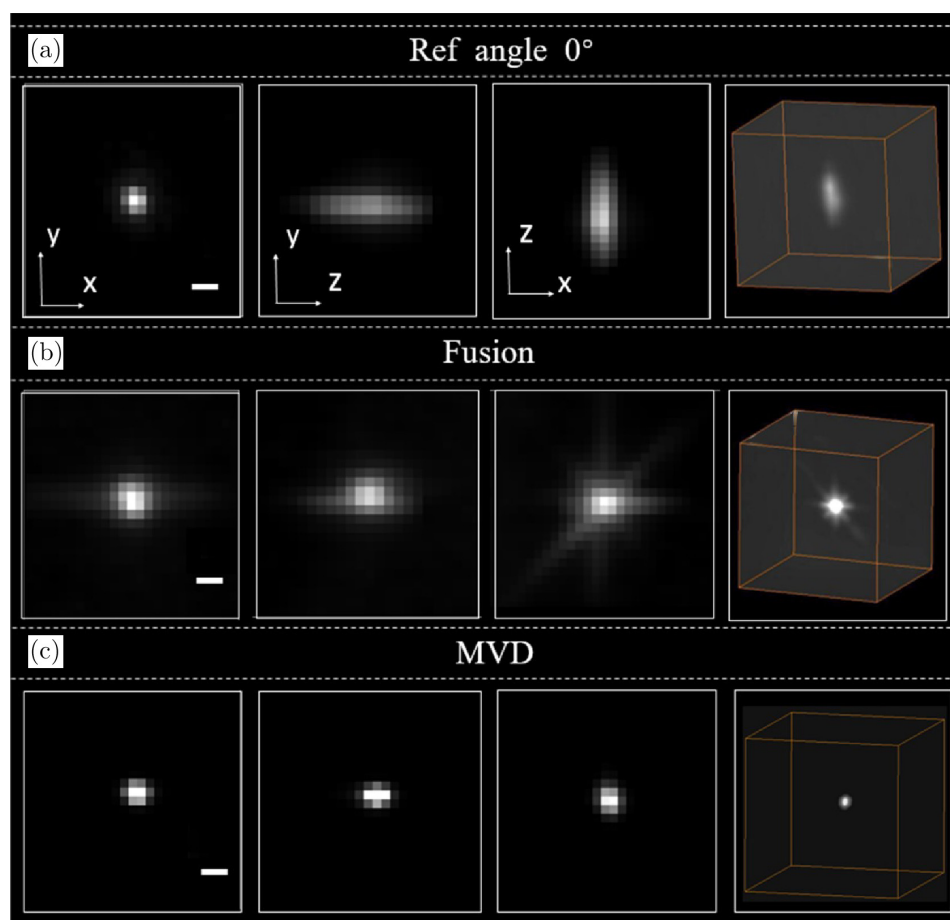


Fig. 2. Characterization using fluorescent bead. (a)–(c) compare the fluorescent beads ( $\sim 1 \mu\text{m}$ ) resolved by single-view LSFM (angle  $0^\circ$ ), 8-view fusion and 8-view Bayesian deconvolution, respectively. The  $x$ - $y$ ,  $y$ - $z$ ,  $x$ - $z$  planes and 3D rendering of the bead are shown from the left to the right. Scale bar is  $5 \mu\text{m}$ .



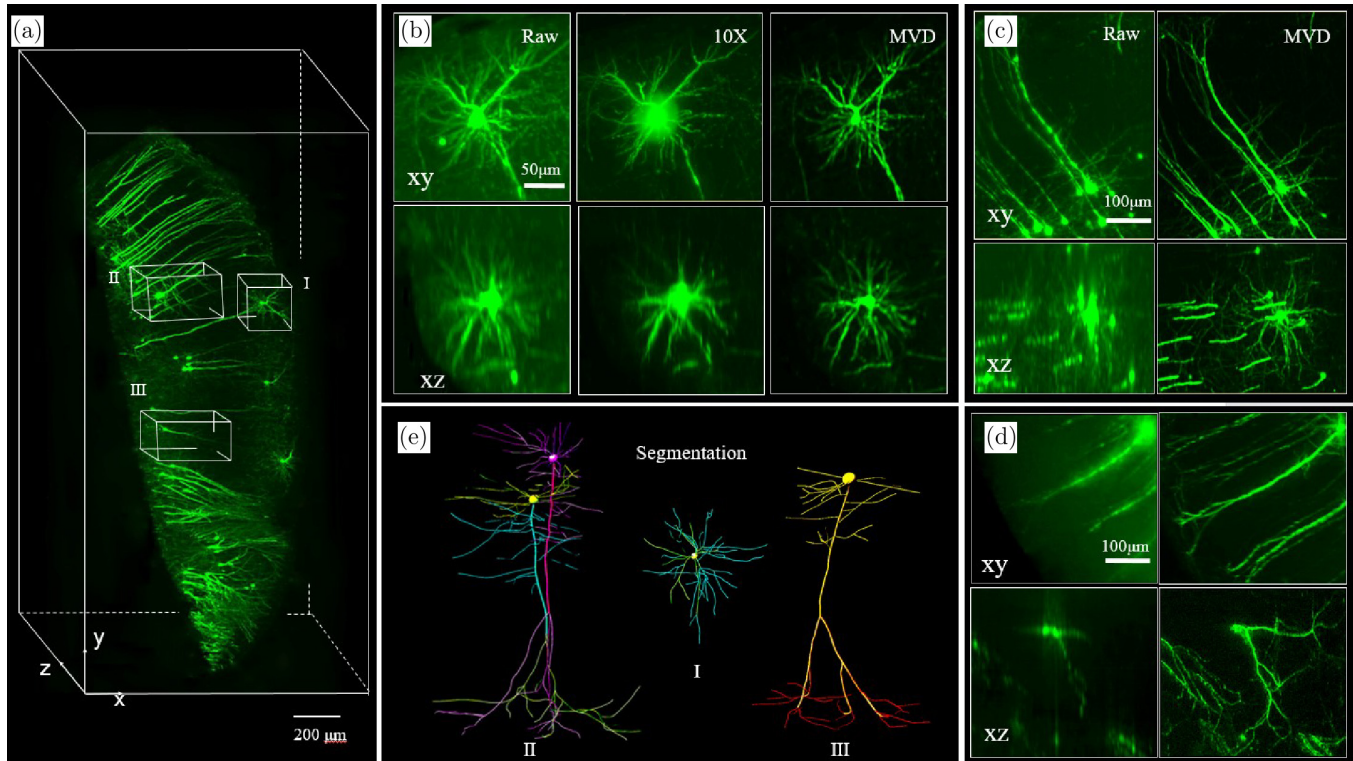


Fig. 3. Isotropic visualization of brain cortex by multi-view LSFM. (a) The 3D rendering of the cleared brain cortex tissue. The magnified views of three selected regions, I–III, are shown as (b)–(d), respectively. The maximum-intensity-projections (MIPs) of  $xy$  and  $yz$  planes of the selected areas are compared by three imaging modes, which are raw single view image (b, left), high-magnification single view image (middle) and MVD image (right). The multi-view deconvolution result demonstrates best visualizations with showing an improved isotropic resolution. (e) Image segmentation of single astrocyte, single pyramidal neuron and two adjacent pyramidal neurons, corresponding to the regions (I) to (III), respectively.

### 3. Conclusion

In this work, we use multi-view light-sheet imaging for the first time to achieve the isotropic imaging of mouse brain at cellular resolution. MVD improves the optical sectioning performance with circumventing the use of high NA, high-maintenance optics at the same time. Thus, it is much less vulnerable to spherical aberration which often causes noticeable deterioration in deep tissue imaging. Compared to the regular single-view LSFM imaging of mouse brain, our method recovers more details, allowing clear segmentation of single neurons. The multi-view deconvolution also represents a cost-effective strategy for brain imaging, without increasing the current LSFM system's cost and complexity. This underlying robustness allows MVD-LSFM prototype to maintain a simple set-up as well as superior performance for large sample imaging. Furthermore, through combining this multi-view approach with other super resolution techniques, a large volume and high-resolution imaging of whole

mouse brain can be expected to map out the complete brain neural network, unraveling the long distance projection that cross over different encephalic regions. Our demonstration makes an initial study towards mouse brain-wide connectome by a simple light-sheet microscope, which can be readily accessed in even resource-limited environments, such as a less-funded biology laboratory. It thereby shows good potential on benefiting the neuroscience, histopathology and other tissue/organ scale studies.

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