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Abstract: Epifluorescence imaging is widely used in cell and molecular biology due to its excellent sensitivity, contrast, and ease of implementation. Optoacoustic imaging has been shown to deliver a highly complementary and unique set of capabilities for biological discovery, such as high spatial resolution in noninvasive deep tissue observations, fast volumetric imaging capacity, and spectrally enriched contrast. In this Letter, we report on a hybrid system combining planar fluorescence and real-time volumetric fourdimensional optoacoustic imaging by means of a fiberscope integrated within a handheld hemispherical ultrasound detection array. The in vivo imaging performance is demonstrated by non-invasive visualization of fast contrast agent perfusion through the mouse brain. The proposed synergistic combination of fluorescence and optoacoustic imaging can benefit numerous studies looking at multi-scale in vivo dynamics, such as functional neuroimaging, visualization of organ perfusion and contrast agent uptake, cell tracking, and pharmacokinetic and bio-distribution analysis.

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Optics Letters

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Hybrid system for in vivo epifluorescence and 4D optoacoustic imaging

3 ZHENYUE CHEN,^{1,2} XOSÉ LUIS DEÁN-BEN,² SVEN GOTTSCHALK,² AND DANIEL RAZANSKY^{1,2,*}

⁴ ¹Faculty of Medicine, Technical University of Munich, Ismaninger Str. 22, 81675 Munich, Germany

5 ²Institute for Biological and Medical Imaging (IBMI), Helmholtz Center Munich, Ingolstädter Landstr. 1, 85764 Neuherberg, Germany

6 *Corresponding author: dr@tum.de

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Epifluorescence imaging is widely used in cell and molecular 9 biology due to its excellent sensitivity, contrast, and ease of 10 implementation. Optoacoustic imaging has been shown to 11 12 deliver a highly complementary and unique set of capabilities for biological discovery, such as high spatial resolution 13 in noninvasive deep tissue observations, fast volumetric im-14 aging capacity, and spectrally enriched contrast. In this 15 16 Letter, we report on a hybrid system combining planar fluo-17 rescence and real-time volumetric four-dimensional opto-18 acoustic imaging by means of a fiberscope integrated within a handheld hemispherical ultrasound detection array. 19 20 The in vivo imaging performance is demonstrated by non-21 invasive visualization of fast contrast agent perfusion through the mouse brain. The proposed synergistic combi-22 23 nation of fluorescence and optoacoustic imaging can benefit numerous studies looking at multi-scale in vivo dynamics, 24 25 such as functional neuroimaging, visualization of organ perfusion and contrast agent uptake, cell tracking, and pharma-26 27 cokinetic and bio-distribution analysis. © 2017 Optical Society of America

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33 **1** Fluorescence imaging is a powerful approach for the dynamic visualization of anatomy and function in biological tissues with 34 35 high specificity. A myriad of existing fluorescent compounds (fluorophores) enable to specifically label molecular targets 36 37 in cellular and subcellular structures and, hence, provide experimental observations of gene expression and other molecular 38 39 pathways in health and disease [1]. At the cellular level, state-of-the-art fluorescence microscopes can also overcome 40 the spatial resolution limit imposed by optical diffraction [2] 41 or provide sufficient temporal resolution to capture changes 42 43 in fluorescent indicators of neural activity [3]. However, fluorescence microscopy is inherently constrained by light scatter-44 ing, which limits the reachable depth to ~ 1 mm in diffuse 45 tissues. At macroscopic scales, fluorescent probes with excita-46

tion and emission spectra in the near-infrared (NIR) spectral window may still enable retrieving molecular information from deep tissues [4,5], albeit with poor spatial resolution governed by the diffusive propagation regime of light [6]. Macroscopic epifluorescence imaging in the visible region has found many useful applications, such as monitoring of neuronal activity with calcium or voltage indicators [7,8], while the availability of high-sensitivity cameras in a second NIR window in combination with newly developed fluorescent probes can significantly enhance the imaging depth [9].

In contrast to tomographic imaging methods based on diffuse optics, optoacoustic (OA) imaging is known to deliver a unique set of capabilities that stem from the higher spatial and temporal resolution of ultrasound-based image formation approaches. OA imaging further provides deep penetration, resolution scalability from microscopic to macroscopic dimensions, and spectrally enriched imaging contrast [10-13]. State-of-the-art OA systems have been shown to provide five-dimensional imaging capacity by simultaneously delivering spectrally resolved information three-dimensionally and in real time [14]. The label-free optical absorption contrast exploited in biomedical OA imaging readily enables detecting the presence of intrinsic tissue components, such as oxy- and deoxyhemoglobin, melanin, bilirubin, lipids, and water [15]. Importantly, the inherent spectral sensitivity of multi-spectral OA imaging has enabled sensitive differentiation of many organic fluorescent dyes. Dyes with peak absorption at NIR wavelengths, such as indocyanine green (ICG) [16], are particularly suitable for deep tissue OA imaging due to their high extinction coefficient and a relatively low quantum yield [17].

To this end, a number of approaches have been suggested for combining fluorescence and OA measurements. For example, OA tomography (OAT) and fluorescence molecular tomography have been combined and compared [18]. Two separate OA and planar fluorescence systems have also been hybridized [19,20]. Dual-modality microscopes for superficial imaging applications have further been constructed [21,22]. However, all these approaches were not suitable for simultaneous deep-tissue imaging in both fluorescence and OA modes, while the relatively slow acquisition further hindered the efficient acquisition of dynamic *in vivo* phenomena. Efficient hybridization is also hampered by the limited accessibility of

the imaged area when attempting to collect high-quality data in 89 both fluorescence and OA modes, the latter also necessitating 90 91 liquid acoustic coupling and large tomographic coverage for op-92 **2** timal three-dimensional (3D) image quality [23]. In this Letter, we present a hybrid system based on the integration of a spe-93 cifically designed (EMCCD) fluorescence fiberscope into a 94 95 spherical ultrasound array optimized for four-dimensional 96 (4D or real-time 3D) OA imaging performance. In this way, 97 both fluorescence and OA responses are excited with the same nanosecond-duration laser pulse guided via optical fibers inte-98 99 grated into the fiberscope, which allows effectively exploiting 100 the contrast mechanisms of both imaging modalities.

A layout of the suggested hybrid imaging system is depicted. 101 in Fig. 1. Basically, it consists of a custom-made EMCCD-102 based fiberscope for epifluorescence imaging and a hemispheri-103 cal transducer array for volumetric OA imaging. The transducer 104 array consists of 512 piezocomposite elements disposed on a 105 106 spherical surface with 40 mm radius covering an angle of 140°. The ultrasound sensing elements have 2.5 mm diameter, 107 5 MHz central frequency, and \sim 100% bandwidth (at -6 dB). 108 The distribution of elements guarantees good sensitivity in a 109 110 region of interest (ROI) around the center of the sphere. The fiberscope is composed of a fiber optic image guide and 111 optical relay system, an illumination fiber bundle, and a 112 high-performance air-cooled EMCCD camera. The scope shaft 113 (custom-made by Zibra Corporation, U.S.) integrates a 114 1.4 mm fiber optic image guide composed of 100,000 fibers 115 (inset A in Fig. 1), along with an illumination bundle com-116 posed of seven silica fibers with 600 µm diameter and 0.4 117 numerical aperture (insets B and C in Fig. 1). The ultrasound 118 array features a central 8 mm cylindrical opening that matches 119 120 the outer diameter of the scope's shaft (inset D in Fig. 1). The 121 small diameter of the opening does not significantly affect the 122 effective angular coverage of the spherical array, so that limited view effects in the reconstructed OA images are minimized. 123 124 The EMCCD camera (Andor Luca R, Oxford Instruments) 125 has an active image area of $\sim 9 \times 9$ mm, corresponding to 126 1004×1002 pixels with size 8 µm x8 µm. It has a high spectral sensitivity at visible and NIR wavelengths with extremely low 127 128 noise. An emission filter is placed in front of the camera to selectively filter the fluorescence signals. The illumination bundle 129 was specifically arranged to provide approximately uniform 130 131 illumination at the center of the array with sufficient energy



F1:1 Fig. 1. Layout of the hybrid planar fluorescence system. F1:2 Photographs of the imaging bundle, input, and output ends of the F1:3 illumination bundle and schematic drawing of the transducer array F1:4 are shown in insets A, B, C, and D.

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density to effectively excite both fluorescence and OA 132 responses. Specifically, a short-pulsed (~6 ns duration) wave-133 length-tunable optical parametric oscillator (OPO) laser 134 (InnoLas Laser GmbH, Germany) was used for the excitation. 135 The ultrasound waves generated by the absorption of each laser 136 pulse in the tissue were collected by the 512 individual detec-137 tion elements of the spherical array, simultaneously sampled at 138 40 megasamples per second with a custom-made data acquis-139 ition system (Falkenstein Mikrosysteme GmbH, Germany) 140 and transmitted in real time to a PC workstation for volumetric 141 image reconstruction. At the same time, the fluorescence re-142 sponses acquired by the fiberscope were also transmitted in real time to the PG workstation for display and data analysis. 144

First, we tested the spatial resolution of the hybrid system. For this, a USAF 1951 test target (Thorlabs R3L3S1N) was placed ~ 37 mm away from the tip of the scope shaft, corresponding to its standard working distance. White light was coupled into the illumination bundle of the fiberscope. Bandpass optical filters with 525 nm (± 19.5 nm, Thorlabs MF525-39) and 800 nm (±20 nm, Andover 800FS40-25) were successively placed in front of the camera, and the corresponding images were acquired. A third acquisition was further performed after removing the filters. The same USAF target was used to evaluate the OA resolution in the lateral x-y plane. It was placed at approximately the center of the spherical array geometry and excited with the OPO laser tuned to 700 nm. The excitation laser beam was coupled into the illumination fiber bundle. No signal averaging was performed for the OA data acquisition. The USAF target was also used to calibrate the azimuthal orientation of the epifluorescence and optoacoustic imaging systems by registering fiducial markers in the images.

Results of the resolution characterization experiments are presented in Fig. 2. Images of the entire USAF target acquired through the 525 nm bandpass filter and its zoom-in are shown in Figs. 2(a) and 2(b), respectively. The corresponding images for the 800 nm wavelength and white light illumination are further displayed in Figs. 2(c) and 2(d). The indicated line profiles allow identifying the thinner lines that can be resolved. The resolution achieved when no filter was used (white light) was approximately 20.16 lp/mm (group 4, element 3), while resolutions of 22.62 lp/mm (group 4, element 4) and 12.7 lp/mm (group 3 element 5) were rendered for the 525 and 800 nm excitation wavelengths, respectively. The inferior resolution at 800 nm is attributed to crosstalk between the individual fibers of the optic image guide at this wavelength range. Figure 2(e) shows the cross section of the OA image of the USAF target. A line profile is also displayed, indicating an approximate resolution of 5.66 lp/mm (group 2, element 4) in the x and y directions. This corresponds to the spatial resolution of 177 μ m, in good agreement with the ~5 MHz detection bandwidth of the transducer elements. The table in Fig. 2(f) summarizes the spatial resolution characterization results of the hybrid system.

The synergetic advantages of the real-time hybrid imaging 186 system were subsequently showcased by imaging two 64-day-187 old athymic nude-Fox1^{nu} mice in vivo (Harlan Laboratories 188 LTD, Switzerland). In particular, the brain was imaged follow-189 ing a tail vein injection of 100 µl of ICG at a concentration of 190 750 μ g/ml (~1 mM). The mice were anesthetized with 1–2% 191 isoflurane in oxygen at 0.7-0.8 1/ min. Imaging was performed 192



F2:1 Fig. 2. Spatial resolution characterization of the hybrid system. (a) Image of the entire USAF 1951 target acquired with the F2:2 F2:3 525 nm bandpass filter. The white circle shows the effective FOV F2:4 of the fiberscope. (b)-(d) show the zoomed-in images acquired for F2:5 525 nm, 800 nm, white light illumination, and the corresponding F2:6 1D profiles along the red lines. The imaged area is indicated by F2:7 the red box in (a). (e) Optoacoustic image acquired from the F2:8 USAF 1951 target. A single cross section corresponding to the area F2:9 indicated by a blue box in (a) is shown. (f) Summary table of the mea-F2:10 sured spatial resolution of the hybrid system.

transcranially, but the scalp was partially removed to evaluate 193 how it affects the imaging performance in both modalities. 194 Animal handling and surgical procedures were performed ac-195 cording to the directives on animal experimentation of the 196 Helmholtz Zentrum München and with approval from the 197 Government District of Upper Bavaria. The laser was running 198 at a pulse repetition rate of 25 Hz at 700 nm wavelength. The 199 camera integration time was set to 0.1 s. A long pass filter 200 (Edmund Optics, Stock # 66-227) with an 800 nm cut-on 201 wavelength was placed in front of the camera. Time-lapse fluo-202 203 rescence and 3D OA data were acquired for a total duration of 204 300 s, starting ~10 s prior to the ICG injection. Following data 205 acquisition, volumetric OAT image reconstruction was done with the 3D filtered back-projection formula [24]. To show 206 the signal variation over time, both fluorescence and OA images 207 208 were normalized to their corresponding global maxima within 209 the entire recording period.

Figure 3 shows the hybrid fluorescence and OA images 210 211 acquired from the first mouse after the ICG injection. It can readily be seen that the presence of the scalp causes signifi-212 cant blurring of the underlying vasculature in the fluorescence 213 images, whereas some superficial cortical microvasculature can 214 be more clearly observed when the scalp is removed. In con-215 trast, no deterioration of image quality is observed in the 216 OA images shown in Fig. 3(b), and all the major vessels are 217 clearly observed under both areas with an intact scalp (indicated 218 by the white arrows) and with the scalp removed (indicated by 219 the blue arrows). Thus, clearly resolvable 3D information can 220 be obtained from deep seated vascular structures way beyond 221 2.2.2 the limits of ballistic light penetration.

Figure 4 shows the time lapse imaging results acquired from 223 224 3 the second mouse after the ICG injection. Figure 4(a) shows the fluorescence images captured at different time instances, 225



Fig. 3. Contrast-enhanced imaging of the mouse brain in vivo. F3:1 (a) Fluorescence image of the mouse brain after tail-vein injection F3:2 of ICG. The red curve shows the boundary of the removed scalp. F3:3 (b) Corresponding volumetric OA images (maximal intensity projec-F3:4 tions along z and x axes are shown). The blue arrows show vessels that F3:5 can be observed in both modalities, while the white arrows show the F3:6 vessels that can only be clearly observed in the OA images. F3:7



Fig. 4. Non-invasive time lapse imaging of the mouse brain in vivo F4:1 following ICG injection at t = 0. (a) Series of the epifluorescence images. (b) and (c) Corresponding volumetric optoacoustic images; the maximal intensity projections along the depth (z) and lateral (x) axes are shown respectively. F4:5

and Fig. 4(b) shows the corresponding optoacoustic images in 226 the x-y and y-z planes. Within a short time following the ICG 227 228 injection, both fluorescent and OA signals raise sharply. However, the average fluorescent signal level remains at its 229 highest level at 10 s post-injection, while the OA signal starts 230 decreasing after reaching its peak around the 7.5 s time point. 231 This can be attributed to the lack of depth resolving capability 232 of fluorescence with its surface-weighted signal averaged across 233 different depths (see also Visualization 1). 234

235 To this end, various implementations of OA imaging and OAT have demonstrated powerful performance in visualizing 236 237 and quantifying intrinsic tissue components and exogenous 238 compounds, including fluorescent probes [17,25]. The herein 239 developed combination of real-time epifluorescence and opto-240 acoustic imaging offers important synergistic advantages. First, 241 concurrent real-time validation with a well-established method is crucial for establishing accuracy and reproducibility of the 242 OA imaging results. This is of particular importance for the 243 visualization of rapid in vivo dynamics that cannot be reliably 244 validated on an ex vivo specimen, e.g., in functional neuroimag-245 ing applications [26]. On the other hand, the higher resolution 246 of optoacoustics in deep regions enables better localization of 247 fluorescence agents in microvascular structures. 248

To the best of our knowledge, our proposed solution is the 249 first to offer hybrid fluorescence-optoacoustic imaging of living 250 tissues across large fields of view (FOVs) and real-time perfor-251 mance both in 2D and 3D. The implemented epifluorescence 252 configuration is essential if the sample has limited accessibility, 253 further facilitating image registration and enabling hand-held 254 operation of the hybrid device to optimally support both 255 pre-clinical and clinical studies. The specifically designed fiber-256 scope used for fluorescence imaging enables covering a large 257 258 ROI with high spatial and temporal resolution. The compact design of the fiberscope does not compromise the large angular 259 260 detection coverage necessary for the accurate 3D OA image reconstruction. Light excitation for both modes is done with 261 the same short-pulsed laser source, thus facilitating an effective 262 registration and cross-validation of the images. 263

It was shown that the fiberscope provides optical imaging of 264 265 superficial targets over a large spectral range with 44 µm spatial resolution and effective FOV of ~80 mm². The resolution 266 slightly deteriorates for NIR wavelengths due to crosstalk be-267 268 tween the individual fibers; yet, it matches well the $\sim 175 \ \mu m$ 269 spatial resolution of the optoacoustic system. As a practical example, it was shown that the cortical microvasculature of the mouse 270 brain could be resolved with epifluorescence after scalp removal 271 and contrast enhancement by a fluorescent agent. On the other 272 hand, OA allowed volumetric imaging of the deep brain without 273 deterioration of the spatial resolution with depth. It should be 274 noted that higher spatial resolution can be achieved with nearly 275 the same OA system by using a spherical array with a larger de-276 tection bandwidth which, however, comes at the expense of a 277 smaller effective FOV. The real-time 3D imaging capacity of 278 OA also makes it more suitable for monitoring the dynamics 279 280 of injected contrast agents, even for superficial regions.

In conclusion, the newly developed hybrid system enabled, 281 for the first time, to the best of our knowledge, registered real-282 283 time epifluorescence and 4D OA imaging, making it especially useful for accurate monitoring of fluorescence-based signal dy-284 285 namics in highly scattering samples. The proposed synergistic combination and cross-validation between fluorescence and 286

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optoacoustic imaging can benefit numerous studies looking at multi-scale in vivo dynamics, such as functional neuroimag-288 ing, visualization of organ perfusion and contrast agent uptake, cell tracking, and pharmacokinetic and bio-distribution analysis. 290

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