Visible spatial frequency domain imaging with a digital light microprojector

Alexander J. Lin
Adrien Ponticorvo
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Haotian Cui
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Abstract. There is a need for cost effective, quantitative tissue spectroscopy and imaging systems in clinical diagnostics and pre-clinical biomedical research. A platform that utilizes a commercially available light-emitting diode (LED) based projector, cameras, and scaled Monte Carlo model for calculating tissue optical properties is presented. These components are put together to perform spatial frequency domain imaging (SFDI), a model-based reflectance technique that measures and maps absorption coefficients ($\mu_a$) and reduced scattering coefficients ($\mu_s'$) in thick tissue such as skin or brain. We validate the performance of the flexible LED and modulation element (FLaME) system at 460, 530, and 632 nm across a range of physiologically relevant $\mu_a$ values (0.07 to 1.5 mm-1) in tissue-simulating intralipid phantoms, showing an overall accuracy within 11% of spectrophotometer values for $\mu_a$ and 3% for $\mu_s'$. Comparison of oxy- and total hemoglobin fits between the FLaME system and a spectrophotometer (450 to 1000 nm) is differed by 3%. Finally, we acquire optical property maps of a mouse brain in vivo with and without an overlying saline well. These results demonstrate the potential of FLaME to perform tissue optical property mapping in visible spectral regions and highlight how the optical clearing effect of saline is correlated to a decrease in $\mu_s'$ of the skull. © The Authors. Published by SPIE under a Creative Commons Attribution 3.0 Unported License. Distribution or reproduction of this work in whole or in part requires full attribution of the original publication, including its DOI. [DOI: 10.1117/1.JBO.18.9.096007]

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In this work, we present a low cost, three-wavelength SFDI system that operates in the visible spectral regime using three light-emitting diodes (LEDs) (460, 530, and 632 nm). The cost savings of a consumer electronics-based SFDI system can be appreciated by comparing the price of a commercial LED microprojector (e.g., ~$250 for an AAXA M2 microprojector) with that of a scientific-grade digital light projector (e.g., ~$8000 for a Texas Instrument DLP Discovery 4100 Kit). We sought to quantify this consumer-grade SFDI system’s performance in the more challenging visible regime where $\mu_a \sim \mu_s'$ and small amounts of noise in measured light levels can introduce large inaccuracies in separating absorption from scattering. 14 SFDI instrumentation is described and validated in tissue-simulating Intralipid phantoms, and optical property maps of a mouse brain are measured in order to demonstrate overall sensitivity and performance. In addition, we examine the impact of saline windows commonly used in rodent model neuroimaging in order to assess how this preparation may influence tissue absorption and scattering values. Implementation of our system offers great potential for measuring optical properties of superficial tissues such as skin epidermis and rodent brain cortex.

1 Introduction

Spatial frequency domain imaging (SFDI) is a reflectance-based technique that can measure and map absorption ($\mu_a$) and scattering ($\mu_s'$) coefficients in tissue on a pixel-by-pixel basis. SFDI works by structuring light into sinusoidal patterns and projecting them onto the tissue surface. The tissue acts as a spatial filter and blurs the structured patterns. By projecting patterns of differing spatial frequencies, the modulation transfer function of the tissue can be found from which a unique pair of optical absorption and scattering coefficients is determined. Further filtering of the remitted light with either a series of bandpass filters or with a liquid-crystal tunable filter allows unique spectra of $\mu_a$ and $\mu_s'$ to be found in different tissue types.1,2

Recent applications of SFDI to skin imaging include in vivo monitoring of burn wounds3,4 determining flap perfusion during surgical procedures,5,6 and assessing cutaneous vascular abnormalities.7 SFDI has also been used for characterizing brain in small animal models of stroke,8 glioblastoma,9 and Alzheimer’s disease.10 In each example, multispectral maps of tissue scattering are separately constructed from tissue absorption. This allows formation of chromophore images such as oxy-hemoglobin ($HbO_2$), deoxy-hemoglobin (Hb), lipid, and water using the Beer–Lambert law. The inverse relationship between spatial frequency and average photon pathlength11 also facilitates SFDI depth sectioning and tomography of absorbing and fluorescent inhomogeneities.12-14

1 Methods

2.1 Flexible LED and Modulation Element (FLaME) Instrumentation

We modified a LED-based microprojector (M2, AAXA Technologies, Inc., Tustin, California) to project a field of view of $40 \times 30$ mm$^2$ by extending the focusing tube lens slightly beyond the manufactured limit. All other settings and...
components of the projector were used as received, including the three individual blue, green, and red LEDs centered at 460, 523, and 625 nm, respectively [Fig. 1(b)]. These wavelengths are sufficient for differentiating oxy- and deoxy-hemoglobin concentration: 523 nm is near an isosbestic point for oxy- and deoxy-hemoglobin, oxy-hemoglobin is about twice as absorbing as deoxy-hemoglobin at 460 nm, and deoxy-hemoglobin is about four times as absorbing as oxy-hemoglobin at 625 nm [Fig. 3(a)]. The projector was used as a second monitor and images were created in Matlab (Mathworks) and displayed as figures in the second monitor. The refresh rate of the liquid crystal on silicon chip in the AAXA projector was 70 Hz or about 14.286 ms/frame. Thus, we used multiples of 14.286 ms as the exposure time to achieve consistent light levels.

As shown in the block diagram in Fig. 1(a), multispectral reflectance images were separated spectrally with dichroic mirrors (475DCLP, 560DCLP, Omega Optical, Inc., Brattleboro, Vermont) and bandpass filters (FB460-10, FB530-10, FL632.8-10, Thorlabs, Inc., Newton, New Jersey). Filtered images were detected using three 12-bit charge-coupled device cameras (Flea2G, Point Grey, Richmond, BC, Canada). Images from the three cameras were co-registered with one another using a fiducial marker (reflective sticker, 1-mm diameter) on
a solid tissue-simulating phantom. A crossed linear polarizer (Edmund Optics, Barrington, New Jersey) was also placed before the cameras to reduce the effect of specular reflectance from the sample. The input-output curve (gamma function) of the projector was determined empirically by sequentially projecting 256 grayscale level images on spectralon (Labsphere) and recording the average pixel intensity from the camera, normalized to the brightest projection (Fig. 2). We found that the nonlinear gamma function of the projector distorts a sine wave image input from the computer to appear as a square wave. We adjusted the computer image input levels, based on the gamma function, such that the actual projected image was sinusoidal when detected (Fig. 2). The projector and cameras were connected to a personal computer and controlled by custom LabVIEW software (National Instruments, Austin, Texas).

2.2 SFDI in the Visible

Optical properties were calculated using a multifrequency fitting approach described previously. We sequentially projected five spatial frequencies (0, 0.05, 0.1, 0.2, and 0.4 mm\(^{-1}\)) with each sinusoidal frequency pattern projected three times at phases of 0, 120, and 240 deg. The remitted reflectance was captured by the three cameras simultaneously and saved for offline processing and analysis. Acquisition speed was limited by the camera exposure times for highly absorbing samples (~300 ms for 460 and 530 nm) and software synchronization of the projector display with camera frame grab (this added ~800 ms/frame grab). Total acquisition time for 10 repetitions of five spatial frequencies at three phases (150 images) was approximately 3 min or ~1.1 s/frame. More rapid tissue imaging could be achieved by improving light collection optics and camera sensitivity as well as using dedicated acquisition and control software.

Reflectance at each spatial frequency and wavelength was calculated using

\[
R_{\text{fs}} = \left(2^{1/2}/3 \right) \times \left[ (I_1 - I_2)^2 + (I_1 - I_3)^2 + (I_2 - I_3)^2 \right]^{1/2},
\]

where \(R_{\text{fs}}\) is the demodulated frequency amplitude image and \(I_1, I_2,\) and \(I_3\) are the three captured images at the three different phases by each camera. \(R_{\text{fs}}\) images were further calibrated to silicone phantoms of known optical properties to correct for any system error such as light inhomogeneity or lens aberration. The optical properties of the reference phantoms were acquired using spatially modulated quantitative spectroscopy. The frequency-dependent diffuse reflectance \((R_{\text{d}})\) was then fit to a Monte Carlo model of light transport, and absorption \((\mu_a)\) and reduced scattering \((\mu_s')\) coefficients were calculated on a pixel-by-pixel basis. All analyses were done in Matlab (MathWorks, Natick, Massachusetts).

2.3 Phantom Validations

Hemoglobin is approximately an order of magnitude more absorbing in the blue–green wavelengths (e.g., 460 and 530 nm) versus 632 nm and above [Fig. 3(a)]. While SFDI has been validated in the near-infrared (NIR) where \(\mu_a \ll \mu_s'\), we needed to establish that FLAME could be used to separate absorption from scattering when \(\mu_s \sim \mu_s'\). To determine the relevant range of \(\mu_s\) values, we used the Beer–Lambert law to predict \(\mu_s\) at the three wavelengths when total hemoglobin (THb) ranged from 50 to 150 \(\mu\text{M}\) with 60% oxygen saturation \((\mu_a = 0.03\) to 1.3 mm\(^{-1}\)). Our previous work in mice showed a
THb around 150 μM while others have used concentrations of around 100 μM. Then, keeping \( \mu_0 \) constant at 1 mm\(^{-1} \), we used a scaled Monte Carlo model\(^1\) to predict reflectance as a function of spatial frequency when we varied \( \mu_a \) from 0.01 to 0.1 mm\(^{-1} \) [Fig. 3(b)] and from 0.1 to 1 mm\(^{-1} \) [Fig. 3(c)]. The reflectance changes much more with respect to spatial frequency (\( \delta R_d / \delta f_x \)) in the lowest absorbing sample (\( \delta R_d / \delta f_x = 2.6 \) mm) versus the highest absorbing sample (\( \delta R_d / \delta f_x = 0.038 \) mm), showing low signal-to-noise may be a source of error when inverting the model and fitting for \( \mu_a \) and \( \mu_0 \) at high values of \( \mu_a \).

To validate the performance of the system, we conducted a series of controlled experiments in tissue-simulating phantoms. First, 19 mL solutions of 0.25, 0.5, and 1 g/L napthol green B solution (Sigma, St. Louis, Missouri) were made in double-distilled water and measured in transmission mode with a VIS–NIR spectrophotometer (UV-3600, Shimadzu, Inc., Kyoto, Japan) from 450 to 1000 nm. Similarly, a sample of fresh pig blood was acquired (protocol No. 2007-2743), stored in a vial with heparin anticoagulant, and diluted to a 1:100 ratio in phosphate-buffered saline before being measured in the spectrophotometer. The \( \mu_a \) absorption spectra were calculated by taking the negative logarithm of the percent transmission and dividing by the pathlength traveled (10 mm for the dye solutions, 5 mm for the pig blood solution). After measurement with the spectrophotometer, 1 mL of 20% Intralipid (Fresenius Kabi, Bad Homburg, Germany) was then added to 19 mL of the solutions to mimic scattering in tissue\(^1\) and each solution was measured with the FLAME system.

### 2.4 In Vivo Mouse Brain

We imaged a 3-month-old C57BL/6 mouse under 1.2% isoflurane anesthesia in a 21% oxygen/79% nitrogen air mix (Oxydial, Starr Life Sciences Corp., Oakmont, Pennsylvania). After inducing anesthesia (2% isoflurane), the head was secured in a stereotaxic frame (Stoelting Co., Wood Dale, Illinois) and
body temperature was maintained at 37°C with a thermocouple-controlled heating pad (Cwe, Inc., Ardmore, Pennsylvania). We removed the skin and fascia above the scalp and a well was created on the calibration phantom during FLaME measurements. For determining the effect of the saline well, we prepared a 2-month old senescence-accelerated mouse-prone 8 transgenic mouse as above, but imaged it both with and without the saline well. All procedures were performed in accordance with the regulations of the Institutional Animal Care and Use Committee (IACUC) of the University of California, Irvine (protocol 2010-2934).

Table 1  Table of oxy-hemoglobin (HbO₂) and deoxy-hemoglobin (Hb) fits determined from the spectrophotometer spectrum (450 to 1000 nm) and from the FLaME absorption data at 460, 530, and 632 nm.

|          | 460 nm | 530 nm | 632 nm |
|----------|--------|--------|--------|
| HbO₂ (μM) | 87.7   | 0.011  | 0.002  |
| Hb (μM)  | 3.0    | 0.011  | 0.002  |

Table 2  Absorption and reduced scattering coefficients acquired from FLaME imaging of the blood/Intralipid phantom are shown with standard deviation of the 150,880 pixels in the regions of interest.

| FLaME     | 460 nm | 530 nm | 632 nm |
|-----------|--------|--------|--------|
| μₐ (mm⁻¹) | 0.95 ± 0.05 | 0.86 ± 0.04 | 0.011 ± 0.002 |
| μₐ' (mm⁻¹) | 2.18 ± 0.11 | 1.63 ± 0.07 | 1.32 ± 0.03 |

3 Data Analysis

In post-processing, the 10 repetitions of raw images acquired were averaged before being demodulated, calibrated, and fitted for μₐ and μₐ'. Values for μₐ, μₐ', and hemoglobin were calculated for each pixel in the image. THb was calculated as the sum of oxy-hemoglobin (HbO₂) and deoxy-hemoglobin (Hb). Oxygen saturation (O₂ sat) was calculated as (HbO₂/THb) × 100. ROI were selected and an average value with standard deviation was calculated for each ROI. For phantom comparisons with the spectrophotometer, FLaME-derived μₐ was multiplied by 1.05 to account for dilution with 1 mL Intralipid in 19 mL solution. All analyses were done in MATLAB.

4 Results and Discussion

The strategy to use multiple spatial frequencies in fitting for μₐ and μₐ' was integral in minimizing fitting error, as the impact of uncertainties in diffuse reflectance measurements at one spatial frequency is reduced and data fits are better constrained by multifrequency content [Fig. 4(a)]. The fitted absorption coefficients in the napthol green B titrations were on average −0.064 ± 0.095 mm⁻¹ different from spectrophotometer μₐ's, or −16% ± 11% off [Fig. 4(b)]. If the data are plotted as FLaME μₐ versus spectrophotometer μₐ [Fig. 4(d)], it is more apparent at μₐ = 1.5 mm⁻¹ that the FLaME fit is an outlier. Without this highest point, the FLaME μₐ's were on average −0.035 ± 0.034 mm⁻¹ different from spectrophotometer μₐ's, or −11% ± 13% off. While there is a natural variation in Intralipid batches, we show in Fig. 4(c) that FLaME-fitted scattering values are within the range of the Mie theory-predicted scattering for 1% Intralipid, with a mean error of 3% ± 0.3%.

Interestingly, the −0.035 mm⁻¹ offset in the FLaME-fitted μₐ's compared to the spectrophotometer artificially causes a higher percentage of error at the lower μₐ's (~30%) compared to the higher μₐ's (~5%). Better calibration of the silicone reference phantom at visible wavelengths is needed to correct for this offset.

Fig. 6 A summary of the SFDI process in a mouse brain at 530 nm: (Top row) Raw camera snapshots of mouse brain with projected spatial frequencies. (Middle row) Cropped and calibrated diffuse reflectance images of the mouse brain as a function of spatial frequency. (Bottom row) Pixel-by-pixel fitted μₐ and μₐ' maps of the mouse brain at 530 nm. The midsagittal vein, a prominent vessel on the midline surface of the brain, can be seen on the μₐ map. The sagittal skull suture is marked by increased scattering on the μₐ' map.
In Fig. 5, we see FLaMEμs values within 7% of spectrophotometer values for 460 and 530 nm, but the much lower absorption of blood at 632 nm results in a 78% error (0.011 mm$^{-1}$ versus 0.051 mm$^{-1}$). Absorption measurements at the three wavelengths were fit to hemoglobin concentrations using the Beer–Lambert law and compared to hemoglobin fits from the spectrophotometer (Table 1). For the spectrophotometer measurement, scattering of the red blood cells was modeled to follow a wavelength-dependent power law, $\mu'_s = A\lambda^{-b}$, where $A$ is the scattering amplitude and $b$ is the scattering power. Previously, Mourant et al. showed microspheres with diameters of 0.1 to 2 $\mu$m in solution have $b$ value magnitudes ranging from 4 to 0.37, respectively. The diameter of red blood cells in pig blood is 6 $\mu$m, so we assumed $b$ to be 0.37 and scattering amplitude, $A$, was fit for as the third chromophore in the Beer–Lambert law and found to be $1.4 \times 10^6$. FLaME comparisons with the spectrophotometer hemoglobin fits were within 3% for HbO$_2$, 20% for Hb, 4% for Total Hb, and O$_2$ saturation was 96.7% (spectrophotometer) versus 96.2% (FLaME) (Table 1). The fitted $\mu'_s$ values from FLaME (Table 2) were slightly higher than the napthol green B measurements, probably from the additional scattering from the red blood cells.

A potential application of the FLaME system is to characterize rodent brain absorption and scattering properties in disease models, assess physiologic changes, and monitor therapeutic interventions. We show below in Fig. 6, the mouse brain with skull intact being imaged with 530 nm light. As expected, vessels are clearly seen in the raw and diffuse reflectance images from THb absorption as well as in the $\mu_s$ and $\mu'_s$ maps.

While we used saline to reduce specular reflections from a dry skull, it is unknown how this might affect the detected optical properties. In Fig. 7, we show the FLaME system is sensitive to a reduction in $\mu'_s$ when saline is added to the skull [Fig. 7(f)]. As expected, the scatter-corrected absorption [Fig. 7(e)] and hemoglobin concentrations (Table 3) do not differ significantly. Visible wavelengths only penetrate 250 to 500 $\mu$m into tissue, and optical properties of overlying rodent skull can significantly contribute to optical properties measured by SFDI. The ability to measure intrinsic tissue scattering and the impact of saline well or similar preparations can improve measurement accuracy and allow more quantitative comparisons between different subjects.

### 5 Conclusion

We have described a low-cost multispectral imaging platform that uses a commercially available LED-based digital light projector and a scaled Monte Carlo light propagation model to acquire tissue absorption and reduced scattering properties in visible (blue, green, and red) spectral regions using SFDI. No modifications to the microprojector hardware is required, however, computer-synthesized projection patterns must be corrected for nonuniformities in projector output using a calibration procedure. The accuracy of the FLaME system was 11% and 3%, respectively, for determining $\mu_s$ and $\mu'_s$ in tissue-simulating...
liquid phantoms over a ∼20-fold range of realistic tissue absorption values. FLAME measurements of oxy-, deoxy-hemoglobin, and THb were within 3% to 20% of true values as determined by a spectrophotometer. Optical absorption and scattering maps of a mouse brain were measured in vivo with visible light for the first time, showing this easily accessible platform may have applications in multispectral neuroimaging and similar settings that require quantitative assessment of tissue hemodynamics and composition.

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