Simultaneous measurement of deep tissue blood flow and oxygenation using noncontact diffuse correlation spectroscopy flow-oximeter

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We report a novel noncontact diffuse correlation spectroscopy flow-oximeter for simultaneous quantification of relative changes in tissue blood flow \((rBF)\) and oxygenation \((\Delta [\text{oxygenation}])\). The noncontact probe was compared against a contact probe in tissue-like phantoms and forearm muscles \((n = 10)\), and the dynamic trends in both \(rBF\) and \(\Delta [\text{oxygenation}]\) were found to be highly correlated. However, the magnitudes of \(\Delta [\text{oxygenation}]\) measured by the two probes were significantly different. Monte Carlo simulations and phantom experiments revealed that the arm curvature resulted in a significant underestimation \((\sim 20\%)\) for the noncontact measurements in \(\Delta [\text{oxygenation}]\), but not in \(rBF\). Other factors that may cause the residual discrepancies between the contact and noncontact measurements were discussed, and further comparisons with other established technologies are needed to identify/quantify these factors. Our research paves the way for noncontact and simultaneous monitoring of blood flow and oxygenation in soft and vulnerable tissues without distorting tissue hemodynamics.

Characterization of tissue blood flow, blood oxygenation and oxidative metabolism is important for the diagnosis and therapeutic assessment of vascular/cellular diseases1–7. A wide range of imaging technologies have been developed to measure deep tissue hemodynamics/metabolism, including positron emission tomography (PET), magnetic resonance imaging (MRI), single photon emission computed tomography (SPECT), and Xenon computed tomography (Xenon CT). However, these techniques have some limitations impeding their routine use in clinics, such as large instrumentation, high cost and poor mobility8,9. Some of them also involve exposure to ionizing radiation (e.g., PET, SPECT, Xenon CT).

Near-infrared spectroscopy (NIRS) was initiated in 1977 by Jobsis10 as a simple, fast, portable, relatively inexpensive method for noninvasive quantification of deep tissue oxygenation11,12. Traditional NIRS takes advantage of the low absorption spectrum of tissue in the near-infrared (NIR) range \((650–950 \text{ nm})\) and penetrates deep tissue \((\text{up to several centimeters})^{13}\) to detect light absorption by chromophores such as oxy- and deoxy-hemoglobin \((HbO_2\text{ and } Hb)\). An emerging dynamic NIR technology, diffuse correlation spectroscopy (DCS), has been developed to measure the relative change of blood flow \((rBF)\) in deep microvasculature14–20. DCS uses coherent NIR light to monitor temporal light intensity fluctuations caused by moving scatterers (primarily red blood cells (RBCs) in tissues) for extracting blood flow index \((\text{BFI})\) and \(rBF\). DCS has also been combined with NIRS in hybrid instruments and simple models have been used to estimate tissue oxygen metabolism from the measured blood flow and oxygenation data16,17,19,21,22. The hybrid NIRS/DCS instruments, while effective, are relatively large, complex and expensive.

Our group has recently developed and validated a truly portable and relatively inexpensive dual-wavelength DCS flow-oximeter for simultaneous measurement of \(rBF\) and relative changes in oxy- and deoxy-hemoglobin concentrations \((i.e., \Delta [HbO_2] \text{ and } \Delta [Hb])^{23}\). Instead of physically combining the NIRS and DCS, which increases the instrument cost and dimensions, the dual-wavelength DCS flow-oximeter extracts \(\Delta [HbO_2]\) and \(\Delta [Hb]\) via recording light intensity changes at two wavelengths \((785 \text{ and } 853 \text{ nm})\). The only adaptation necessary to achieve this function is the addition of a second laser diode to the single-wavelength DCS flow device. Being truly portable, easy-to-use and inexpensive, the DCS flow-oximeter is ideal for bedside monitoring in clinics23–29.
Most previous NIR studies have measured tissue hemodynamics/metabolism using optical probes in contact with tissue surfaces. Significant problems with these contact measurements include increased risk of infection of ulcerous tissues and deformation of vulnerable/soft tissues (e.g., breast, muscle) resulted from probe-tissue contact. Deformation of vulnerable/soft tissues may distort measured tissue properties. It is nearly impossible to consistently apply the appropriate amount of pressure and achieve even coverage on vulnerable/soft tissues. In addition, the contact probe is uncomfortable for subjects. Only a few DCS studies have reported noncontact probing of tissue hemodynamics in small animals using camera probes with limited light penetration depth (< 0.5 cm). Recently, our group designed a noncontact DCS flow probe using two separate optical paths (instead of the single optical path used in the camera probes) for the source and detector. This unique design prevents interference between the source and detector paths and allows large separations between the source and detector (e.g., > 1 cm) for blood flow measurements in deep tissues.

The challenge remains for noncontact measurements of both blood flow and blood oxygenation in deep tissues. This study was designed to evaluate a noncontact dual-wavelength DCS flow-oximeter for simultaneous quantification of blood flow and oxygenation changes in deep tissues (e.g., human skeletal muscles). The noncontact DCS flow-oximeter probe was compared against a contact probe used previously in both tissue-like phantoms and noncontact DCS flow-oximeter probe was compared against a condition changes in deep tissues (e.g., human skeletal muscles). The designed to evaluate a noncontact dual-wavelength DCS flow-oximeter, arteries, and tissue with a curved surface on an elliptic cylinder, and the sources and detector were projected on that surface (Fig. 1c). Based on the simulations. The forearm muscle was assumed to be homogeneous in the influence on noncontact measurements we carried out MC Monte Carlo (MC) simulation results. To evaluate the curvature influence on noncontact measurements we carried out MC simulations. The forearm muscle was assumed to be homogeneous tissue with a curved surface on an elliptic cylinder, and the sources and detector were projected on that surface (Fig. 1c). Based on the measured mean values of tissue optical properties and forearm dimensions in our subjects (Table 1), we assigned homogenous

### Results

#### Subject characteristics

Table 1 lists the forearm dimensions ($d_1$ and $d_2$), adipose tissue thickness (ATT), and baseline values of $\mu_a$ and $\mu'_a$ at the two wavelengths (measured by the Imagent tissue-oximeter) from the 10 subjects. These quantities were used to calculate rBF, DPF, and $\Delta$[oxygenation] (see Methods section).

| Table 1 | Subject characteristics |
|---------|-------------------------|
| Subject # | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | mean ± s. d. |
| $d_1$ (cm) | 5.45 | 6.30 | 5.00 | 5.25 | 6.30 | 7.20 | 5.30 | 6.80 | 6.90 | 7.10 | 6.16 ± 0.84 |
| $d_2$ (cm) | 7.15 | 8.50 | 6.80 | 6.80 | 7.85 | 10.15 | 6.85 | 9.30 | 9.60 | 9.30 | 8.23 ± 1.30 |
| ATT (cm) | 0.35 | 0.37 | 0.26 | 0.42 | 0.38 | 0.42 | 0.33 | 0.48 | 0.38 | 0.30 | 0.37 ± 0.06 |
| $\mu_a$ (cm$^{-1}$, 785 nm) | 0.20 | 0.15 | 0.12 | 0.12 | 0.17 | 0.15 | 0.15 | 0.15 | 0.18 | 0.08 | 0.15 ± 0.03 |
| $\mu'_a$ (cm$^{-1}$, 785 nm) | 4.29 | 5.42 | 7.99 | 7.33 | 7.61 | 5.40 | 7.87 | 8.48 | 7.76 | 4.98 | 7.61 ± 1.51 |
| $\mu_a$ (cm$^{-1}$, 853 nm) | 0.21 | 0.18 | 0.15 | 0.13 | 0.18 | 0.17 | 0.16 | 0.17 | 0.20 | 0.11 | 0.17 ± 0.03 |
| $\mu'_a$ (cm$^{-1}$, 853 nm) | 3.88 | 5.00 | 7.67 | 6.99 | 6.71 | 5.08 | 7.01 | 7.80 | 6.75 | 5.74 | 6.26 ± 1.20 |

#### Tissue-like phantom experimental results

Figure 2 shows $\Delta\mu_a$ and flow index ($D_a$ changes during ink titrations ($\Delta\mu_a = 0.0125$ cm$^{-1}$ at 785 nm for each step) measured by the noncontact and contact DCS flow-oximeter probes. The $\Delta\mu_a$ values measured by both probes agreed well with the theoretical values at both wavelengths (maximum discrepancies < 10%; Fig. 2a and Fig. 2c). The noncontact measurements of $\Delta\mu_a$ were highly correlated with the contact measurements at both wavelengths and the regression slopes were close to 1 (slope = 0.97; $R^2 = 0.99$, $p < 10^{-5}$ at 785 nm; slope = 0.94, $R^2 = 0.99$, $p < 10^{-5}$ at 853 nm; Fig. 2b and Fig. 2d). As expected, since adding ink did not change the Brownian motions ($D_a$) of Intralipid particles, flow values measured by both probes were fairly constant (maximum variations < 8%) and the discrepancy between the two measurements was < 5% throughout the titration steps (Fig. 2e). Taken together, the results from the phantom experiments indicated the high consistency of noncontact and contact measurements of flow index ($D_a$) and optical property ($\Delta\mu_a$) in a homogenous medium with semi-infinite geometry.

#### Cuff occlusion responses

Figure 3 shows typical responses of rBF (a) as well as $\Delta[HbO_2]$ and $\Delta[Hb]$ (c) during arterial cuff occlusion measured by the contact and noncontact probes in the forearm muscle of one subject. The dynamic trends and magnitudes in rBF responses measured by the two probes were similar (regression slope = 0.94, $R^2 = 0.94$, $p < 10^{-5}$; Fig. 3b). The dynamic trends in $\Delta[HbO_2]$ and $\Delta[Hb]$ were also similar (Fig. 3c), however, the magnitude of $\Delta$[oxygenation] measured by the noncontact probe was significantly lower than that measured by the contact probe (regression slope = 0.40, $R^2 = 0.65$, $p < 10^{-5}$; Fig. 3d).

Similar response trends in both rBF ($R^2 = 0.83 ± 0.09$, $p < 10^{-5}$; Fig. 4a) and $\Delta$[oxygenation] ($R^2 = 0.76 ± 0.16$, $p < 10^{-5}$; Fig. 4b) were observed from all subjects (n = 10). The magnitudes of rBF measured by the noncontact probe agreed well with those measured by the contact probe; the mean value of regression slopes (0.86 ± 0.20; Fig. 4a) was not significantly different from 1 ($p = 0.051$). By contrast, the magnitudes of $\Delta$[oxygenation] measured by the two probes were significantly different; the mean value of regression slopes was much less than 1 (0.44 ± 0.12, $p < 10^{-5}$; Fig. 4b).

Interestingly, the regression slopes of $\Delta$[oxygenation] from the ten subjects (Fig. 4b) were found to be significantly correlated with the dimensions of the measured forearms: $d_1$ ($R^2 = 0.45$, $p = 0.03$; Fig. 5a) and $d_2$ ($R^2 = 0.46$, $p = 0.03$; Fig. 5b). By contrast, there were no correlations between the slopes of rBF and the dimensions of the measured forearms. These discoveries implied that the forearm curvature was one of the factors influencing blood oxygenation measurements.
optical properties for the forearm ($\mu_a = 0.15$ cm$^{-1}$ and $\mu'_a = 6.71$ cm$^{-1}$ at 785 nm; $\mu_a = 0.17$ cm$^{-1}$ and $\mu'_a = 6.26$ cm$^{-1}$ at 853 nm) and varied the dimensions of the elliptic cylinder ($d_1 = 5, 6, 7$ cm; $d_2 = 4d_1/3$) in comparison to the semi-infinite geometry. With those assigned values above, the DPF$\alpha$ values at the two wavelengths were calculated based on either equation (6) for semi-infinite geometry or MC simulations for elliptic cylinders. The MC-simulated DPF$\alpha$ values for elliptic cylinders with different dimensions were then normalized (divided) by those derived from the analytical solution with semi-infinite geometry. The $\Delta[HbO_2]$ and $\Delta[Hb]$ were calculated from the normalized DPF$\alpha$ (Fig. 6a) based on equations (3–5) with an assumption (for simplicity) of equal $d_1$ and major axis $d_2$.

Figure 6a shows the normalized DPF$\alpha$ (DPF$\alpha$ ratios) at the two wavelengths and corresponding $\Delta$[oxygenation] calculated from $\Delta[HbO_2]$ and $\Delta[Hb]$. The DPF$\alpha$ ratios (~80%) were significantly less than 1 ($p < 10^{-5}$), leading to ~20% underestimations of $\Delta$[oxygenation].

Figure 6b shows that the elliptic cylinder curvature also induced ~20% underestimations in blood flow index ($\alpha D_h$), as compared to the values calculated with semi-infinite geometry. However, the curvature influence on the relative change of $\alpha D_h$ was very small (<1%, Fig. 6c), and can be ignored. More specifically, when we created a $\alpha D_h$ variation ($0.1 \times 10^{-8}$ to $5 \times 10^{-8}$ with an increment of $0.1 \times 10^{-8}$) for elliptic cylinder and semi-infinite geometries, the discrepancies in $\alpha D_h$ were observed (regression slope = 0.80, 0.81, 0.85 for $d_1 = 5, 6, 7$ cm, respectively; Fig. 6b). However, no discrepancies in rBF were found (regression slope = 0.99, 1.00, 0.99 for $d_1 = 5, 6, 7$ cm, respectively; Fig. 6c).

Overall, MC simulation results revealed that ignoring the curvature of the forearm would cause an underestimation in $\Delta$[oxygenation], but not in rBF. These results are consistent with those obtained through in vivo muscle measurements described above.

**Calibration of curvature effect.** The underestimation of $\Delta$[oxygenation] due to failure to consider the effect of forearm curvature can be calibrated using the corrected DPF$\alpha$ values calculated by the MC simulations with elliptic cylinder geometry. Figure 7 illustrates the calibration results in $\Delta$[oxygenation]. Calibration resulted in a substantial increase in the regression slope in each subject. On average, the calibrated regression slopes ($0.56 \pm 0.10, n = 10$) were significantly higher ($p < 10^{-5}$) than the original slopes without calibration ($0.44 \pm 0.12, n = 10$). Unlike the original slopes, the calibrated slopes were not correlated with the dimensions of the measured forearm: $d_1$ ($R^2 = 0.31, p = 0.10$) and $d_2$ ($R^2 = 0.28, p = 0.12$). This implied the efficiency of the calibration algorithm for reducing the curvature influence. The remaining
Figure 2 | Experimental results in tissue-like liquid phantom for comparisons of noncontact and contact measurements of $\Delta\mu_a$ and $D_B$. The raw data (150 data points at each titration step) for $\Delta\mu_a$ ((a) and (c)) and $D_B$ (e) were averaged and displayed along with standard deviations (error bars). Notice that some error bars were too small to be observed. The $\Delta\mu_a$ values measured by both probes during ink titration agreed well with the theoretical values at the two wavelengths: 785 nm (a) and 853 nm (c). The noncontact and contact measurements of $\Delta\mu_a$ (i.e., 150 data points at each titration step) were significantly correlated at both wavelengths: (b) and (d). The flow indices ($D_B$) measured by both probes were almost constant throughout the titration steps (e).
discrepancy between the noncontact and contact measurements of \( \Delta [\text{oxygenation}] \) (i.e., the calibrated regression slopes were still significantly smaller than 1) will be discussed in the next section.

**Discussion**

The newly developed dual-wavelength DCS flow-oximeter can simultaneously measure blood flow and blood oxygenation\(^{23}\), thus providing deeper insight into tissue physiological status than either parameter alone. Previous studies with DCS flow-oximeter have measured tissue hemodynamics using fiber-optic probes placed on tissue surfaces\(^{23–29,40}\), which may result in deformation of soft tissues (e.g., breast, muscle), thus distorting the measured tissue properties\(^{33–35}\). The present study was designed to build and validate a noncontact dual-wavelength DCS flow-oximeter (Fig. 1) for simultaneous measurements of \( rBF \) and \( \Delta [\text{oxygenation}] \) without physically touching the tissue. The noncontact system overcomes the contact limitations and is particularly powerful for longitudinal studies where repeatable measurements over time are needed\(^{36}\).

This noncontact probe was compared against a contact probe in tissue-like liquid phantoms (Fig. 1b) and forearm muscles (Fig. 1a). The experimental results in liquid phantoms were very encouraging; noncontact and contact measurements in both flow indices (\( D_a \)) and optical property changes (\( \Delta \mu_o \)) were highly consistent (Fig. 2). During the *in vivo* study, as expected, both \( rBF \) and \( \Delta [\text{oxygenation}] \) responses in forearm muscles during cuff occlusion measured by the two probes were highly correlated (Fig. 3 and Fig. 4). The magnitudes of \( rBF \) responses measured by both probes were also highly consistent (Fig. 4a). Surprisingly, the magnitudes of \( \Delta [\text{oxygenation}] \) measured by the noncontact probe were significantly lower than those measured by the contact probe (regression slope = 0.44 ± 0.12, \( n = 10 \); Fig. 4b).

It should be noticed that the results discussed above (Fig. 2 to Fig. 4) were extracted using the analytical solutions for a homogenous medium with semi-infinite geometry (equations (3–6)). These solutions have been broadly used to analyze the data obtained in contact measurements of blood flow and blood oxygenation\(^{16,18,19,21–23,25–29,31,32}\). In fact, the contact probe (foam pad) secured by the elastic tape compressed the soft tissue of the forearm resulting in a flat tissue surface underneath the probe (approximating a semi-infinite geometry). By contrast, noncontact measurements did not change the shape of the forearm, which may be treated as an elliptic cylinder for simplicity (Fig. 1c). The fact that the regression slopes of
Δ[oxygenation] were significantly correlated with the dimensions of the measured forearms (Fig. 5) implied the influence of forearm curvature on blood oxygenation measurements.

It is difficult to derive analytical solutions for irregular geometries such as the surface of an elliptic cylinder. MC simulations were thus used to investigate the forearm curvature influence. A series of elliptic cylinders with different dimensions mimicking the various shapes of forearms were examined for evaluation of the curvature influence on noncontact measurements. MC simulations demonstrated that the forearm curvature resulted in ~20% underestimations in Δ[oxygenation] (Fig. 6a) and DSB (Fig. 6b), but had little effect on rBF (Fig. 6c). Similar underestimations in Δ[oxygenation] and DSB yielded from the curvature-induced decrement of photon pathlengths in comparison to the semi-infinite geometry can be divided out when calculating the relative change of ΔSB (rBF). Previous studies have also reported boundary/curvature effects on the quantification of tissue optical properties and blood oxygenation measurements\(^5,6\), which are consistent with our findings.

Prompted by the finding of curvature influence, we attempted to correct the underestimation of noncontact measurements in Δ[oxygenation] resulting from the forearm curvature. Using the measured forearm dimensions and optical properties for each individual subject as input (Table 1), we performed the MC simulations to compute the DSB, which was used to calculate Δ[oxygenation]. The MC-calibrated regression slopes for Δ[oxygenation] (0.56 ± 0.10, n = 10) were significantly higher than those (0.44 ± 0.12, n = 10) computed using the DSB calculated with semi-infinite geometry ignoring the curvature influence (Fig. 7). After calibration, the regression slopes were not correlated with the dimensions of the measured forearm, implying the calibration efficiency for reducing the curvature influence. It should be noted that considering the forearm as a simple elliptic cylinder may lead to evaluation errors. With the help of other 3-dimensional imaging modalities such as CT or MRI to characterize forearm curvature, the MC-based calibrations can be done more precisely.

The MC-based calibrations did not completely eliminate the discrepancy in Δ[oxygenation] between the noncontact and contact measurements in forearm muscles (i.e., the calibrated regression slope = 0.56 ± 0.10 < 1, n = 10). Furthermore, although it is insignificant (p = 0.051), the mean value of regression slopes for rBF (0.86 ± 0.20, n = 10) was also smaller than 1 (Fig. 4a). Apparently, curvature influence was not the only factor causing the discrepancies between the two measurements in biological tissues.

The residual discrepancies between the noncontact and contact measurements may result from tissue heterogeneous responses as well as differences in measurement techniques (i.e., noncontact versus contact). Even though the regions measured by the two probes were close (Fig. 1a), they did not completely overlap. The heterogeneity of muscle responses at different regions to arterial cuff occlusion may partially contribute to the discrepancies between the two measurements.

The noncontact probe may collect stray light in addition to the light reflected directly from forearm skin surface (without going through the deep muscle tissue). The stray light generates background noises and does not contain any dynamic information about tissue hemodynamics. Furthermore, previous studies have demonstrated that signals from different layers (cutaneous tissues and muscles) during arterial cuff occlusion were differentiated, revealing a strong hemodynamic response from the muscle\(^5\). Taken together, tissue hemodynamic responses during cuff occlusion measured by the noncontact probe may be underestimated.

On the other hand, the contact measurement may be influenced by imperfect coupling between the probe and tissue generating noises as well as the contact pressure distorting tissue hemodynamic responses. For example, researchers have observed more than twofold increases of muscle blood flow during application of external compression over a pressure range of 13–23 mmHg on human forearm\(^4\) or 8–18 mmHg on human lower leg\(^5\). The results were interpreted as an autoregulatory response following the decrease of the vascular transmural pressure gradient. Such local compression may also cause the redistribution of tissue blood oxygenation at the region around the contact probe, leading to more tissue heterogeneous responses. In addition, the probe contact compression may result in a decrease in adipose tissue thickness (ATT) over the flexor muscle, which may distort hemodynamic measurements.

The ATT influence is another concern with NIRS measurements\(^5,6\). The penetration depth of NIR light in biological tissues is known to be roughly half of the S-D separation\(^2\). An S-D separation of 2.6 cm was used for the present study, probing a depth of ~1.3 cm. Previous studies have shown that for an S-D separation of 2 cm or greater, the contribution of skin is less than 5% of total light absorption, and the detected signal is mainly from skeletal muscle tissues\(^6\). The results imply that the sensitivity of the NIRS/DCS signal detected with an S-D separation of 2.6 cm should not be significantly affected by the ATT observed in our study (0.37 ± 0.06 cm, n = 10; Table 1). Furthermore, no significant correlations were observed between ATT and rBF or ATT and Δ[oxygenation] in this study, implying that ATT did not adversely influence our measurements. There have been studies correcting the variation in measurement sensitivity due to ATT based on Monte Carlo simulations\(^6\), which may be employed in future work with subjects that have significant ATT.

In conclusion, we report a novel noncontact dual-wavelength DCS flow-oximeter for simultaneous measurement of blood flow and blood oxygenation in deep tissues. This noncontact detection system is unique in that its source and detector paths built by optical lenses...
are completely separated/isolated, which avoids the interference between the source and detector and enables a large source-detector distance for deep tissue measurements. The noncontact probe has been compared with a contact probe in tissue-like phantoms and forearm muscles. The dynamic trends in both flow and oxygenation changes in forearm muscles measured by the two probes were found to be highly correlated. Compared to the contact measurements, however, the magnitudes of blood oxygenation changes measured by the noncontact probe were significantly lower. Monte Carlo simulations and tissue-like phantom experiments confirmed that ignoring the forearm curvature caused a significant underestimation of oxygenation changes, which can be corrected using a calibration algorithm based on the MC simulation. However, the curvature influence was not the only factor causing the discrepancies between the noncontact and contact measurements in tissue blood oxygenation. Further comparisons with other established technologies for tissue blood flow and oxygenation measurements are needed to identify other possible factors (such as tissue heterogeneous responses and differences in measurement techniques) that may cause the residual discrepancies between the two measurements. Nevertheless, our research paves the way for simultaneous and noncontact monitoring of blood flow and oxygenation in soft (e.g., breast, muscle) and vulnerable (e.g., ulcerous) tissues without distorting tissue hemodynamics.

Methods

Instrumentation. DCS flow-oximeter. The dual-wavelength DCS flow-oximeter has been described in detail elsewhere36. Briefly, two continuous-wave (CW) long-
coherence (>5 meters, Crystalaser, NV, USA) lasers at wavelengths of 785 and 853 nm emit light alternatively into the tissue via two multimode source fibers (WF200/220/245, Ceramoptec, MA, USA) bundled together. Photons transport through tissues, and only some of them are captured by a single-mode detector fiber (SM800, Fibercore, CA, USA) placed on the tissue surface at a distance of several millimeters or centimeters from the source fibers. The detector fiber is connected to a single-photon-counting avalanche photodiode (APD, PerkinElmer, Canada) which detects photons from a single speckle area on the tissue surface. The APD outputs are fed into a correlator board (correlator.com, NJ, USA) to compute the light intensity and intensity temporal autocorrelation function. The sampling rate of the dual-fed into a correlator board (correlator.com, NJ, USA) to compute the light intensity and intensity temporal autocorrelation function. The sampling rate of the dual-wavelength DCS flow-oximeter is 0.4 Hz.

Blood flow index is extracted by fitting the normalized electric field autocorrelation function $g_2(t,\tau)/g_2(t,0)$ calculated from the measured light intensity autocorrelation function $g_2(t,\tau)=I(f,t)/(f,t+\tau))/I(t)^2$ through Siegert relation. Here $H(f,t)$ is the detected light intensity at position $f$ and time $t$, (...) denotes a time average, and $\tau$ is the autocorrelation delay time. The electric field temporal autocorrelation function $G_2(t,\tau)$ satisfies the correlation diffusion equation in highly scattering media as:

$$DV^2 - \nu\mu_s - \frac{1}{2}\nu\mu_r^2\lambda(\Delta^2(r))G_2(f,t,\tau) = -vS(f)$$

(1)

Where $\mu_s$ is medium absorption coefficient, $\mu_r$ is reduced scattering coefficient, $D=v/3\mu_r$ is the photon diffusion coefficient, $v$ is light speed in the media, $k_0$ is the wavenumber, $S(f)$ is the source light distribution, $z$ is defined as the ratio of moving scatterers to total scatterers, and $\Delta^2(r)$ is the mean-square displacement of moving scatterers (e.g., RBCs) at time $t$. The homogeneous CW solution to equation (1) for a semi-infinite geometry is:

$$G_2(r,\tau)={\frac{vS}{4kD}}\left(\frac{\exp\left(-K_1(2\tau)\right)}{r_1} - \frac{\exp\left(-K_2(2\tau)\right)}{r_2}\right)$$

(2)

Here $\rho$ is the source-detector (S-D) separation, $S_0$ is source intensity, $K_1'(t) = 3\mu_0\mu_s'' + \mu_r^2\lambda(\Delta^2(t)), r_1 = [(p^2 + (z + z_0^2))^\frac{1}{2}, r_2 = [p^2 + (z + z_0^2)^2]^{\frac{1}{2}}, z_0 = 1/\mu_r', z_0 = (2 + R_{sg})/(3(1 - R_{sg})), R_{sg} = -1.440m^{-1} + 0.710m^{-1} + 0.668 + 0.068n, $ and $n = 1.75$ is the ratio of refractive indices between the medium and air.

The exact form of equation (1) depends on the nature and heterogeneity of scatterers' motion. The widely used diffusion model was originally applied in highly scattering media such as colloidal suspensions or Intralipid solutions where the dynamics is Brownian motion of scatterers. For this case, $<\Delta^2(t)> = 6D_t\tau$, where $D_t$ is the Brownian diffusion coefficient of moving scatterers. Interestingly, it has been observed that the diffusion model fits the autocorrelation curves well over a broad range of tissue types. The combined term, $\Delta D_{DG}$ is referred to as blood flow index (BFI) in biological tissues and is commonly used to calculate $BFI_{Baseline}/BFI_{Oxygenated}$. In general, biological tissues contain relatively static scatterers (e.g., mitochondria) and dynamic scatterers (e.g., RBCs). The signals scattered from the static scatterers do not contribute significantly to the temporal decay of the autocorrelation function. To account for this effect, a unitless factor, $\alpha$, is introduced to represent the fraction of light scattering events from dynamic scatterers. In contrast to biological tissues, all scatterers (Intralipid particles) in the liquid phantom are dynamic and contribute significantly to the temporal decay of the autocorrelation function, resulting in $\alpha = 1$. Accordingly, the flow index of the liquid phantom is reported as simply $D_{DG}$.

Blood oxygenation variations ($\Delta[HbO_2]$ and $\Delta[Hb]$) are obtained from the measured light intensity changes at the two wavelengths ($\lambda_1 = 785$ nm and $\lambda_2 = 853$ nm) using the modified Beer-Lambert law:

$$\Delta\mu_r(\lambda) = \ln(\frac{I_{\lambda_2}}{I_{\lambda_1}}) / \rho DPF$$

(3)

$$\Delta[HbO_2] = \frac{\epsilon_{HbO_2}(\lambda_1)\Delta\mu_r(\lambda_1) - \epsilon_{Hb}(\lambda_2)\Delta\mu_r(\lambda_2)}{\epsilon_{HbO_2}(\lambda_1)\ln(\frac{I_{\lambda_2}}{I_{\lambda_1}})}$$

(4)

$$\Delta[Hb] = \frac{\epsilon_{Hb}(\lambda_1)\Delta\mu_r(\lambda_1) - \epsilon_{HbO_2}(\lambda_1)\Delta\mu_r(\lambda_1)}{\epsilon_{Hb}(\lambda_2)\ln(\frac{I_{\lambda_2}}{I_{\lambda_1}})}$$

(5)

Where $\Delta\mu_r(\lambda)$ is the relative change of $\mu_r$ at wavelength $\lambda$, $I_{\lambda_1}$ and $I_{\lambda_2}$ are the measured light intensities at the baseline (B) and at time $T$, respectively, $\epsilon_{HbO_2}(\lambda)$ and $\epsilon_{Hb}(\lambda)$ are the extinction coefficients of HbO2 and Hb, respectively. The differential pathlength factor (DPF) is the ratio of mean photon pathlength over the S-D separation ($\rho$), which can be calculated from the measured $\mu_r$ and $\mu''$:

$$DPF = \frac{-3\mu''(\lambda)\rho}{2(1 + \rho\sqrt{3\mu_s'(\lambda)\mu_r(\lambda)})}$$

(6)

Fiber-optic probes. Figure 1 shows a schematic of the noncontact and contact probes for DCS flow-oximeter and experimental setup for in vivo (Fig. 1a) and phantom...
(Fig. 1b) measurements. Compared to our previous noncontact probe design for DCS blood flow measurements, the only difference was to bundle a second source fiber (S2) to the original source fiber (S1) and connect the two source fibers to the dual-wavelength DCS flow-oximeter. Again, the noncontact probe was designed using two isolated optical paths consisted of lenses and collimators for source and detector respectively (Fig. 1a and Fig. 1b). This unique design avoided the interference between the source and detector paths and enabled the setting of large S-D separations (e.g., 2.6 cm, used in this study) for deep tissue measurements. The noncontact measurements were compared with the contact measurements conducted by a contact probe (Fig. 1a and Fig. 1b) with an identical S-D separation (2.6 cm) confined in their positions by a black foam pad. The foam pad was placed on the surface of the measured tissue (Fig. 1a) or liquid phantom (Fig. 1b) using elastic tape or a custom-made holder. Room light was turned off during measurements.

**Experimental protocols.** Tissue-like liquid phantom. Tissue-like liquid phantoms, comprised of Intralipid, distilled water and India ink, have been extensively used for NIRS experiments. Intralipid phantoms have been preferred over Intralipid subchondrate hemorrhage (Acta. Chir. Inogul, 55, 69–74 (2008)) and 5-minute recovery measurement following the release of occlusion. The algorithms described above simply assume the tissue as a homogenous medium with semi-infinite geometry (flat surface) for testing the noncontact and contact measurements.

In vivo human muscle. With signed Institutional Review Board approval consents, 10 healthy volunteers participated in the experiments. The subject lay supine and extended right forearm. The adipose tissue thickness (AATT) over the forearm flexor muscle was measured using a skinfold caliper (Lange 85300, Texas, USA). For evaluating the influence of forearm curvature on optical measurements, we simply assumed the forearm as an elliptic cylinder with minor axis $d_2$ and major axis $d_1$ (Fig. 1c). The $d_2$ and $d_1$ for each individual were measured using a vernier caliper. A hand-held fiber-optic contact probe connected to a commercial frequency-domain NIRS system (Imagent, ISS Inc. IL, USA) was used to quantify the absolute baseline control of scattering ($\mu_s'$) and Brownian motion ($\mu_b$) while India ink (10% of Black India 44201, Higgins, MA, USA) provides the control of absorption ($\mu_a$). We set a constant $\mu_a$ (10 cm$^{-1}$) and varied $\mu_b$ (0.0500, 0.0625, 0.0750, 0.0875, 0.1000 cm$^{-1}$ at 785 nm) by adding ink to compare the DPF, results measured by the noncontact and contact probes. The $d_1$, range was set based on the realistic changes in forearm muscles that we measured during cuff occlusion. Approximate six-minute data (150 data points) were collected and averaged at each titration step. Although temperature can affect Brownian motions ($\mu_b$) of Intralipid particles, the room temperature was controlled constant ($\sim$23 °C) in order to obtain stable flow. The tissue-like phantom provides an ideal homogenous tissue model with semi-infinite geometry (flat surface) for testing the noncontact and contact measurements.

**Data analysis.** For simplicity, we reduced the two oxygenation quantities to one and named it as “$A[O_2]$” (i.e., $A[O_2] = A[HbO_2] - A[HHb]$). Since DCS flow signals are not sensitive to wavelength, we reported flow data with only one wavelength (785 nm)$^{33,34}$. Linear regression analyses were carried out in each individual for evaluating the correlation/conistency of the contact and noncontact measurements. The regression slope, correlation coefficient, and $p$-value were reported for each subject. Ideally, the regression slope should be equal to 1 if the two measurements were consistent. Two-tailed Student t-test was used to test the consistency between the two measurements (i.e., whether the regression slope is statistically equal to 1), $p < 0.05$ was considered significant. All statistical results were presented as a mean ± standard deviation (s.d.).
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Author contributions

G.Y. conceived and supervised this project. T.L. wrote the initial manuscript; G.Y., T.L. and Y.L. revised the manuscript. Y.L. and G.Y. designed the noncontact probe. Y.L., T.L. and H.T. collected the data. T.L. and Y.L. analyzed the data. T.L. studied the curvature effect on measurements and performed MC simulations. C.H. prepared some figures. Y.S. provided technical assistance for data collection and analysis. M.S. participated in data interpretation. All authors reviewed and approved the manuscript.

Additional information

Competing financial interests: The authors declare no competing financial interests.

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