Dynamic fluorescence imaging for multiparametric measurement of tumor vasculature

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Abstract. Angiogenesis is essential for tumor growth and a promising target for cancer therapy. Blood vessel monitoring is an indispensable tool for evaluation and development of anti-angiogenic drugs. Here, we report a new noninvasive in vivo imaging tool, named dynamic fluorescence imaging (DyFI), for the simultaneous measurement of multiple vascular parameters including vascular density, perfusion rate, and permeability using spatiotemporal profiles of indocyanine green. Using DyFI in a tumor xenograft model, we quantitatively measured multiple vascular parameters in tumors and normal tissues with high spatial resolution. The multimodality of this method allowed us to find negative spatial correlations between perfusion and permeability. Moreover, DyFI was effective for revealing the early effects of an anti-angiogenic drug. We suggest that DyFI could be a useful tool for the preclinical development of anti-angiogenic drugs.

Keywords: in vivo imaging; vascular function; anti-angiogenesis.

1 Introduction

A solid tumor larger than 1 mm in diameter requires an adequate blood supply for growth and metastasis.1, 2 Accordingly, inhibition of angiogenesis is one of the most promising strategies for cancer therapy. More than 50 angiogenesis inhibitors that target aberrant tumor vasculature are currently in clinical trials and several drugs are approved for clinical use.3, 4 During angiogenesis and anti-angiogenic therapeutic regimens, vascular density, perfusion, permeability, and other blood vessel changes in structure and function can occur simultaneously.5 The response to most anti-angiogenesis therapies are dynamic and have time scales ranging from several hours to days. Hence, introduction of a sensitive and efficient imaging tool that can noninvasively measure multiple vascular parameters could facilitate anti-angiogenic drug development.

To meet this demand, various dynamic vascular imaging techniques have been developed. Dynamic contrast-enhanced magnetic resonance imaging (DCE-MRI) and perfusion computed tomography use the time kinetics of a contrast agent to extract multiple vascular parameters pertaining to blood flow, permeability, and blood volume.7 These techniques were applied successfully in clinical trials of anti-angiogenic drugs, but require a heavy hardware system with sophisticated analysis software.8 Ultrasound techniques, such as Doppler ultrasound and contrast-enhanced ultrasound with microbubbles, have also been clinically used to measure vascular physiology, but are limited to blood flow.2, 9 To map vascular parameters efficiently, optical methods, especially those using time-series analysis of indocyanine green (ICG), have been developed and applied to assess cerebral blood flow10 or vascular permeability in tumors.11, 12

To our knowledge, however, there has been no optical method that simultaneously measures multiple parameters of biological significance, including vascular density, perfusion, and permeability.

We have developed a novel noninvasive imaging tool for monitoring multiple vascular parameters in vivo. This method is based on time-series imaging of an intravenously administrated fluorescence probe and a novel mathematical model to extract important biological parameters, including not only permeability, but also vascular density and perfusion. In tumor-bearing mice, we could measure multiple vascular parameters with high spatial resolution. Using this method, we revealed the early effects of an anti-angiogenic drug on tumor vasculature.

2 Materials and Methods

2.1 Xenograft Tumor Model

Seven-week-old male nude mice (BalB/cAnNCrIgBi-nu; Charles River Japan, Yokohama, Japan) were used in all of the experiments. In experiments with dynamic fluorescence imaging (DyFI), mice received subcutaneous injections of 1 × 107 U251MG cells into the right lower flank under ketamine/xylazine anesthesia. The animal care and experimental procedures were performed with the approval of the Animal Care Committee of KAIST (Daejeon, South Korea).

2.2 Dynamic Fluorescence Imaging

The system for DyFI was built to allow serial acquisition of ICG fluorescence emission with high spatial resolution and several drugs are approved for clinical use.
a charge-coupled device (CCD) camera (PIXIS1024; Princeton Instruments, Princeton, New Jersey), two 760-nm light-emitting diode (LED) arrays (SMC760; Marubeni America, Santa Clara, California) to excite the ICG dye, a near-infrared (NIR)-sensitive right-angled mirror (W47-308; Edmund Optics, Singapore), two 760 ± 20-nm excitation bandpass filters (Asahi Spectra USA, Torrance, California), and an 830 ± 20-nm emission bandpass filter (Asahi Spectra USA), as shown in Fig. 1(a). The LED arrays were adjusted to gain a uniform illumination field, and the mirror was introduced to visualize both dorsal and lateral sides of the animal simultaneously [Fig. 1(b)]. The optical setup was shielded with a light-tight box to ensure high signal-to-noise ratios.

DyFI was performed when the tumor size reached approximately 1 cm$^3$. For time-series ICG imaging, mice were anesthetized with ketamine/xylazine, laid on the imaging system, and held with tape. Under the serial acquisition mode of a CCD camera at 3-s intervals, ICG (0.1 ml of 400 μmol/L; Sigma Chemical, St. Louis, Missouri) was injected intravenously through the tail vein. The time-series image acquisition of the fluorescence emission lasted for 10 min after the ICG injection. Following the serial imaging, a bright-field image of the mouse was taken to aid in the selection of regions of interest.

Image processing and regression analyses were performed using matlab software (MathWorks, Natick, Massachusetts) functions, including nonlinear least-squares fitting (lsqnonlin). After loading 200 successive images (0 to 10 min at 3-s intervals), the average background noise was subtracted in each image. Using the lsqnonlin function on the images obtained from 1 to 4 min, the half-life of ICG was determined in the manually selected region where the ICG dynamics were almost completely exponential. Since the ICG dynamics contain dense information at early time points, the images were sampled sparsely at later time points with the experimentally determined variable sampling rate to ensure the best fit; usually, 1 out of 1 image until 1 min, 1 out of 3 to 5 images until 5 min, and 1 out of 5 to 10 images until 10 min were used. For each pixel, excluding the background, the temporal ICG dynamics were regressed to the devised mathematical model [Eq. (4)] using the lsqnonlin function. The regression analysis in a pixel generates a set of parameters including volume fractions for each compartment, perfusion, permeability, and vascular density. To obtain each parameter map, the spatial distributions of the corresponding parameters were displayed using the imagesc function. For merged parameter maps, each parameter was normalized, mapped to red, green, or blue, superimposed, and displayed using the imagesc function.
2.3 Anti-Angiogenesis Study
VEGF-Trap (25 mg/kg) was injected intraperitoneally when the subcutaneous tumor size became approximately 1 cm³, and DyFI was performed immediately before and 2 days after the treatment.

2.4 Statistical Analysis
The data are expressed as means ± standard error of mean (SEM). Statistical differences were determined using the t-test or analysis of variance (ANOVA) as indicated, with P < 0.05 considered statistically significant.

3 Results
3.1 Development of Dynamic Fluorescence Imaging
To trace blood dynamics in vivo, we used the nontoxic tricarboxylate fluorophore ICG. The action spectrum of ICG is in the near-infrared region and it has greater tissue transmittance and lower scattering compared to visible light. Using ICG, it is possible to visualize relatively deep-lying structures in vivo. When administered intravenously, ICG predominantly binds to serum proteins, especially albumin. Accordingly, the probe is suitable for studying macromolecular permeability, as well as the perfusion of tumor vasculature. The ICG–albumin complex is segregated in the liver and excreted by the hepatic or renal pathway. Since this elimination process is an exponential decay with a half-life of 3 to 5 min, the arterial input function, which is indispensable for pharmacokinetic analysis, can easily be determined with high accuracy.

To perform time-series fluorescence imaging, we developed a reflectance NIR fluorescence imaging system as described in Sec. 2 [Fig. 1(a)]. After tail vein injection of ICG into an anesthetized tumor-bearing mouse, fluorescence emission was acquired with 3-s intervals for 10 min. The ICG profile in the tumor was distinctive with high but uneven fluorescence due to aberrant vessel formation. No apparent retention of ICG was observed in tumors or normal tissues, which might interfere with repetitive imaging [Fig. 1(b)].

The spatiotemporal dynamics of ICG were modeled mathematically using differential equations [Fig. 1(c)]. Three main determinants for ICG pharmacokinetics consisting of elimination, perfusion, and permeability were considered in the model. The arterial input function (CA) was determined by the elimination of ICG in the liver and was expressed as an exponential decay function with the time constant τ. Although some studies assumed a biexponential model to consider the long- and short-term decay of ICG, since the long-term decay is on the order of hours, ICG decay for 10 min can be approximated to a single exponential Eq. (1). The half-life of ICG decay ranged from 3 to 5 min. Therefore, ICG concentrations in an artery (CA) with time can be expressed as Eq. (1) (t is time; C₀ is the initial concentration for ICG).

\[ C_A = C_0 e^{-t/\tau}. \]  

Transport of ICG through the vascular lumen, specifically between the arterial compartment to the compartments of the capillaries and veins (CCV), is indicative of perfusion and was represented using Fick’s law with the flow rate F [Eq. (2)]. Permeability, indicating bidirectional transport of ICG between intravascular and extravascular compartments (CT), was modeled with two parameters of extravasation (Ke) and intravasation (Ki) [Eq. (3)].

\[ C_{CV} = F(C_A - C_{CV}) - K_e C_{CV} + K_i C_T, \]  

\[ C_T = K_i C_{CV} - K_e C_T. \]

We defined F in s⁻¹ as the perfusion rate, and Ke in s⁻¹ as the permeability. The sum of these equations describing ICG dynamics in tissue and vascular compartments in proportion to their volume fraction (VA, volume fraction for the arterial compartment; VCV, volume fraction for the capillary and vein compartment; VT, volume fraction for the extravascular compartment) describes the regional ICG dynamics mathematically [Eq. (4)].

\[ I = V_A C_A + V_{CV} C_{CV} + V_T C_T. \]

We defined V_A + V_{CV} in arbitrary units as the vascular density. To determine whether the model is relevant, we tested the fitness of the devised model with experimentally obtained time-series ICG fluorescence data. In both tumors and normal tissues, the curve fits matched the experimentally obtained ICG dynamic data, reflecting the relevance of the model [Fig. 1(d)].

Regression analysis of time-series ICG dynamics at a pixel generates a set of pharmacokinetic parameters comprising vascular density, perfusion, and permeability. By applying regression analysis in a pixel-by-pixel manner, we could map the spatial distribution of multiple pharmacokinetic parameters with high resolution [Figs. 2(a)–2(c)]. We called this method dynamic fluorescence imaging.

3.2 Measuring Vascular Parameters in Tumors Using DyFI
In multiparametric pharmacokinetic maps, tumors showed distinctive spatial profiles of functional vascular density, perfusion, and permeability compared to the normal counterparts. Vascular density was markedly enhanced but unevenly distributed, suggesting spatial heterogeneity of tumor-induced vessel formation [Fig. 2(a)]. Unexpectedly, high vascularity did not always couple to better perfusion in the tumors. While perfusion increased in some regions, it decreased in other regions, demonstrating functionally inefficient angiogenesis [Fig. 2(b)]. Nevertheless, perfusion was usually enhanced at the periphery of tumors and decreased near the center of the tumors, which contained several poorly perfused foci. These ischemic foci often led to macroscopic necrosis at the surface, reflecting the relevance of measuring perfusion by DyFI and its diagnostic potential. Highly permeable vasculature was observed only in the restricted area of tumors [Fig. 2(c)]. The permeability values for tumor vasculature were comparable to those measured using other optical methods and DCE-MRI using albumin-Gd-diacetylated albumin-penta-acetic acid (DTPA).

While vascular density and permeability were significantly increased in tumors compared to normal tissues, no significant change was observed in the mean perfusion rate. Since a broadly distributed shape was consistently observed in the histograms of tumors, we evaluated whether differences in spatial heterogeneity existed between tumors and normal tissues. Spatial heterogeneity was defined as the standard deviation.
of a pharmacokinetic parameter in the region of interest. For all of the pharmacokinetic parameters measured, tumors had significantly higher spatial heterogeneity compared to normal tissues (Fig. 3).

The spatially resolving, multimodal nature of DyFI allowed co-registration of the acquired pharmacokinetic maps without the need for correcting movement artifacts. Therefore, we studied whether spatial correlations exist among different pharmacokinetic parameters in tumors. Although high permeability and regional ischemia have already been reported as tumor characteristics, the spatial relationships between perfusion and permeability have not been elucidated. In the merged maps of perfusion and permeability, we found that the highly permeable regions co-registered with the ischemic regions [Fig. 4(a)]. The negative spatial correlation between perfusion and permeability was clearly demonstrated in tumors using regional analysis. When a tumor was divided into three concentric regions with the ischemic focus at the center, permeability increased significantly nearer the center, while perfusion decreased in this region [Figs. 4(b) and 4(c)]. This pattern was observed in five of six ischemic foci in five tumors.

3.3 Application of DyFI for Preclinical Study of Anti-Angiogenic Therapy

Since DyFI was successful for measuring tumor functional vascular parameters, we addressed whether DyFI might be a useful tool for a preclinical study of anti-angiogenic therapies. We
designed a preclinical study to test the short-term effects of vascular endothelial growth factor (VEGF)-Trap, a soluble decoy receptor for VEGF. DyFI was performed twice in each animal, and the changes in perfusion and permeability were evaluated immediately before and 2 days after a single treatment with VEGF-Trap (n = 4). Although the tumors showed no apparent changes, the spatiotemporal ICG dynamics were notably altered by treatment with the VEGF-Trap, suggesting rapid remodeling of the tumor vasculature [Fig. 5(a)]. The most noticeable change was permeability. For all of the treated mice, highly permeable regions in tumors almost completely disappeared within 2 days of treatment. Mean permeability levels of the treated tumors became comparable to normal tissues [Figs. 5(b) and 6(a)]. This rapid normalization in permeability was consistent with a previous study that used a multi-tyrosine kinase inhibitor to target the same VEGF signaling pathway. No significant change was detected in mean tumor perfusion. However, significant decreases occurred in the spatial heterogeneity of perfusion (n = 4, P = 0.022, paired t-test), reflecting redistribution of blood flow and a noticeable, but nonsignificant, decrease in the ischemic area of all tumors [Figs. 6(b)–6(d)].

4 Discussion

In this report, we introduced DyFI—a novel in vivo imaging tool for the simultaneous measurement of functional vascular parameters based on mathematical modeling of ICG pharmacokinetics. We applied DyFI to tumor-bearing mice, which had tumors with abnormal vasculature. With high spatial resolution, we quantitatively measured vascular heterogeneity, vascular density, and permeability to macromolecules in the tumors. Multimodality revealed a negative spatial correlation between perfusion and permeability in the tumors. The noninvasive nature of the technique allowed us to trace dynamic changes in vascular...
function during anti-angiogenic therapy. Notably, we demonstrated that VEGF-Trap rapidly normalized vascular permeability and redistributed blood perfusion. Although no previous report on vascular normalization by VEGF-Trap exists, this finding was in agreement with previous studies using other inhibitors targeting the same VEGF signaling pathway.\(^8\) Since vascular functions are direct physiological markers for anti-angiogenesis, DyFI is a promising tool for the preclinical development of anti-angiogenic drugs.

Since perfusion and permeability are quantitative parameters with units of \(s^{-1}\), comparing the parameters among different individuals or between different time points of an individual is possible. However, vascular density, which is intrinsically dependent on illumination intensity, should be carefully analyzed because even with a uniform illumination field, an irregularly shaped sample could yield shaded areas. For these regions, we did not consider vascular density in the follow-up anti-angiogenesis study. In addition, changes in hemodynamic status by body temperature or anesthesia could systemically modify perfusion and permeability. In our follow-up experiments, we ruled out this possible bias by confirming the minimal variation of perfusion in normal counterparts. If significant variation in hemodynamic status occurred, normalization with the normal counterparts should be performed for comparative studies.

Our mathematical model is applicable to other imaging contrast agents with the following considerations. First of all,

\[ P < 0.001 \]

Fig. 5 Rapid vascular normalization effect of VEGF-Trap on perfusion and permeability. DyFIs were performed at day 0 and day 2. VEGF-Trap was administered immediately after the first imaging. (a) Bright-field images and representative ICG dynamics. r.f.u., relative fluorescence unit. (b) Changes in the spatial profile of perfusion and permeability. Note that poorly perfused regions at day 0 became normalized after the VEGF-Trap treatment (arrows).

Fig. 6 Quantitative analysis of the rapid vascular normalization effect of VEGF-Trap. VEGF-Trap was administered immediately after the first imaging at day 0. (a) Quantitative analysis of permeability. (b) Quantitative analysis of perfusion. (c) Quantitative analysis of spatial heterogeneity of perfusion \((n = 4, \text{paired } t\text{-test})\). The spatial heterogeneity of perfusion was defined as the standard deviation of the perfusion parameters in the region of interest. (d) Quantitative analysis of the ischemic area. The ischemic area was defined using three criteria (regions with perfusion rates lower than 100\%, 70\%, or 50\% of normal counterparts).
arterial dynamics can differ between imaging agents. The arterial input function should be adjusted based on the molecule dynamics in the arterial blood. Next, excitation and emission spectrum are distinct among chromophore molecules. Since the tissue penetrability of light depends on the wavelength, the acquired parameters reflect the vascular function of different tissue thicknesses from the surface. Moreover, the permeability parameter is negatively correlated with the effective size of the molecule in the plasma. Accordingly, the permeability parameter should be interpreted in the context of effective hydrodynamic molecular size.

Time-series ICG imaging has been performed successfully in stroke patients and patients with peripheral vascular disease, hence, we anticipate the direct clinical application of DyFI. The use of near-infrared light with clinically approved ICG allows safe and deep tissue imaging. Moreover, DyFI would likely be time and cost efficient for patients and doctors during diagnosis or repetitive evaluation of therapeutic interventions. Nonetheless, several obstacles exist for clinical use. Since DyFI is based on light reflectance with limited penetrability, development of endoscopic methods may be necessary for imaging internal organs or deep-seated tumors. Moreover, movement artifacts during imaging may be severe in awake patients. Minimizing movement during imaging or computationally compensating for movement artifacts will be challenging.

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References