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# Feasibility of direct digital sampling for diffuse optical frequency domain spectroscopy in tissue

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## Abstract

Frequency domain optical spectroscopy in the diffusive regime is currently being investigated for biomedical applications including tumor detection, therapy monitoring, exercise metabolism and others. Analog homodyne or heterodyne detection of sinusoidally modulated signals has been the predominant method for measuring phase and amplitude of photon density waves that have traversed through tissue. Here we demonstrate the feasibility of utilizing direct digital sampling of modulated signals using a 3.6 gigasample/second 12 bit analog to digital converter. Digitally synthesized modulated signals between 50 MHz and 400 MHz were measured on tissue-simulating phantoms at six near-infrared wavelengths. An amplitude and phase precision of 1% and 0.6° were achieved during drift tests. Amplitude, phase, scattering and absorption values were compared with a well-characterized network analyzer-based diffuse optical device. Optical properties measured with both systems were within 3.6% for absorption and 2.8% for scattering over a range of biologically relevant values. Direct digital sampling represents a viable method for frequency domain diffuse optical spectroscopy and has the potential to reduce system complexity, size and cost.

**Keywords:** diffuse optical spectroscopy, frequency domain, photon density waves, digital sampling, analog to digital conversion

(Some figures may appear in colour only in the online journal)

## Introduction

Frequency domain diffuse optical spectroscopy instruments have been utilized for a number of biological applications including breast cancer detection [1, 2], chemotherapy monitoring [3–6], cerebral hemodynamic monitoring [7] and others. Typically, the intensity of near-infrared light is sinusoidally modulated in the MHz or GHz range and injected into biological tissue. As these photon density waves (PDW) propagate through the tissue, they become

attenuated in amplitude and delayed in phase. Amplitude and phase measurements depend on the absorption and scattering properties of the tissue, as well as the distance between source and detector. When the mean photon absorption length is sufficiently longer than the mean scattering length (typically  $\mu_s(1 - g)/\mu_a$  must be greater than 10), and detection occurs sufficiently far from the source, PDWs lose their directional flux and the photon propagation can be modeled using the frequency-domain diffusion equation [8].  $\mu_a$  and  $\mu_s$  can then be determined by an iterative minimization algorithm which matches measured amplitude and phase data to amplitude and phase calculated from a forward model of light propagation [9, 10].

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The methods employed to determine amplitude and phase information from measured frequency domain signals generally fall into the categories of either heterodyne detection or homodyne detection [11]. Heterodyne detection mixes the sample signal with a reference signal that is offset in frequency to produce a lower intermediate frequency (IF). The IF retains the phase and amplitude information and allows extraction of these values using digitization or analog detection chips. Several groups that have developed clinical or preclinical frequency domain diffuse optical instruments employ heterodyne techniques [2, 10, 12–16]. Several of these systems utilize commercially available heterodyne (vector) network analyzers to determine phase and amplitude. Homodyne detection measures amplitude and phase without mixing and most groups accomplish this with an IQ demodulator [7, 12, 17, 18]. Some groups have utilized homodyne detection with CCD imaging by modulating an image intensifier with a reference signal to produce phase sensitive images [19, 20]. For all of these methods, one or more modulation frequencies can be used depending on the specifics of the instrumentation and several groups scan through a range of modulation frequencies in attempts to improve fitting and increase signal-to-noise [10].

Analog methods for determining phase and amplitude for diffuse optical measurements require either significant capital expense (entry level commercial vector network analyzers are typically more than \$15 000) or, if custom instrumentation is used, require design and fabrication of complex RF circuits. In this manuscript we report the construction of a relatively simple and cost-effective all-digital frequency domain system. The RF source signal is generated using direct digital synthesis (DDS), while detection is accomplished without frequency mixing using high speed digital sampling. The raw digitization method is made possible by recent technological advances in fast analog-to-digital conversion. Here the reference and sample time-domain signals are directly digitized and amplitude and phase information is computed during post processing using standard fast Fourier transforms (FFTs). We demonstrate that this method can be used to accurately determine amplitude and phase measurements of PDWs in diffuse media. Extracted optical properties match those determined with a vector network analyzer based frequency-domain system.

## Methods

### *Experimental design*

A schematic of the system is shown in figure 1. The National Semiconductor ADC12D1800 Analog to Digital Converter (ADC) integrated circuit (IC) was utilized for direct sampling of RF signals. This is a 12-bit, dual-channel ADC capable of 3.6 gigasample per second (GSPS) sampling in a single-input mode or 1.8 GSPS sampling per channel in interleaved mode. In this work, one channel was used to measure a reference signal while the other channel was used to measure the output of the optical detector. The full scale voltage of this ADC is 800 mV (2 dBm) with an impedance of 50  $\Omega$ . For all

experiments, 4096 samples were collected at each modulation frequency. Because the channels are interleaved, 2048 samples were collected from each channel. Data were transferred to a controlling laptop through a USB interface and a custom dynamic linked library (dll).

The RF source used for all measurements was the Analog Devices AD9910 DDS IC. This is a 1 GSPS, 14-bit digital to analog converter capable of outputting sinusoidally modulated signals up to 400 MHz when a 1 GHz reference clock is used. Manufacturer specifications detail a 0.23 Hz frequency resolution and the evaluation board used in these experiments outputs 1.4 dBm of RF power at 50 MHz at the gain setting used here. The RF power drops to  $-1.77$  dBm at 400 MHz for the same gain setting. The modulation frequency of the DDS is controlled through a USB interface.

The RF output of the DDS was amplified by a 10 dB amplifier (Mini-Circuits ZHL-1010+) and then split with a 10.4 dB directional coupler (Mini-Circuits ZFDC-10-128) so that approximately 2 dBm is directed to the reference channel of the ADC and 10 dBm is directed to a SP6T RF switch. The RF switch directs the RF power to one of six bias tees which are connected to six different near infrared laser diodes. DC power is supplied to the bias tees by a DC current source (LDC 3900, ILX Lightwave, Bozeman, MT). Laser diodes are 656 nm, 687 nm, 778 nm, 814 nm, 824 nm, and 852 nm. For all the diodes the DC current level is balanced with the RF power set so that there is no clipping of the modulated light signal. Typical light output delivered to the sample is 20 mW.

The laser diodes are each fiber coupled to 400  $\mu$ m fibers that combine to a six-in-one configuration at the distal end. These fibers allow contact to either a solid silicone or immersion in a liquid phantom. A 3.0 mm (solid core) fiber is used to collect reflected light at specific source–detector fiber separations. The detection fiber is coupled to a 3 mm active-area avalanche photodiode (APD) (Hamamatsu, Model S6045-05) with a custom biasing circuit and amplifier. The gain of the APD is approximately 60 and the additional gain supplied by the module is approximately 40 dB. The voltage modulated APD output is then sent to the sample channel of the ADC (1.8 GSPS per channel). A 400 MHz low-pass anti-aliasing RF filter was used before both the reference and sample channels of the ADC (there is less than a 1 dB loss in the DC–400 MHz pass-band of the filter, mini-circuits part #VLF-400+).

Controlling software was designed using Visual Basic 6 (Microsoft, Redmond, WA) which iteratively selected the tuning frequency of the DDS and called the dll to collect samples from the ADC. Frequency sweeps between 50 MHz and 400 MHz in 1 MHz steps were collected for drift experiments, sweeps between 100 MHz and 298 MHz with steps of 2 MHz were used for accuracy and optical property comparisons to the network analyzer based system.

The linearity of the ADC was tested over a broad range of RF powers ( $-90$  dBm to 2 dBm) at 50, 150, 250, and 350 MHz using the output of a function generator (Rhodes-Schwarz SMIQ03B).

Measurements from the digital system described above were compared with those taken from a well characterized

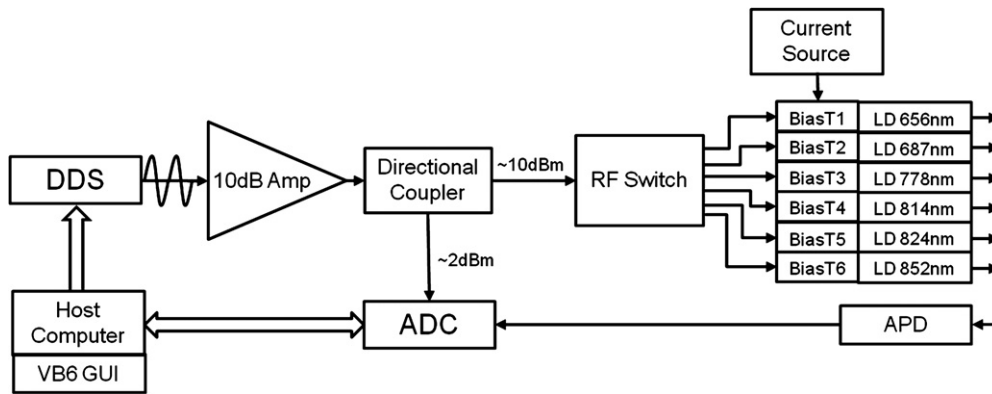


Figure 1. Layout of digital system.

network-analyzer based system which has been used for more than 10 years to collect clinical data from breast cancer patients [10]. The same RF switch, bias tees, laser diodes, dc current source, source and detector fibers, APD and APD module were used for both the digital system and the network-analyzer based system.

For experiments evaluating the equivalence of extracted optical properties between the digital system and the network analyzer based system, liquid phantoms were created using whole milk and the absorbing dye nigrosin combined in different proportions. The tips of the fiber probes were placed approximately 1 cm below the surface of the liquid at various source-detector separations.

### Data analysis

All processing of raw data was done in Matlab (Mathworks Inc., Natick, MA). A FFT with a rectangular window function was performed on 2048 samples collected from the ADC from both the reference and the sample channels at each modulation frequency. The amplitude and phase was determined at each modulation frequency for each channel and the ratio of sample-to-reference and the difference between the sample and reference phase were computed. These referenced measurements were used for analyses of the noise floor, drift, accuracy, and determination of optical property experiments. An analytical model of the diffusion equation in the frequency-domain with infinite boundary conditions was used to determine absorption and scattering coefficients from amplitude and phase measurements at all measured modulation frequencies using multiple source-detector separations [9].

## Results

### Linearity

The system was linear through a high dynamic range. Figure 2 shows the linearity between RF power output from the function generator and RF power measured by the ADC at 50 MHz. Fit residuals above 1 dBm were measured below  $-65$  dBm.

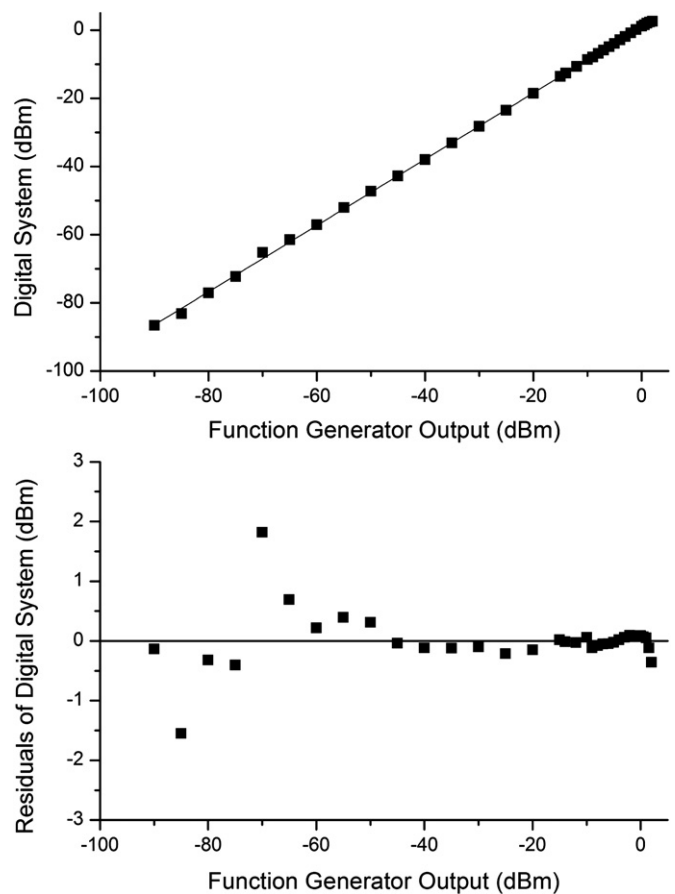


Figure 2. Linearity.

### Noise floor and dynamic range

The theoretical ideal noise floor of the ADC assuming a full-scale signal and taking into account the FFT process gain (in this case a DFT of length 2048) is  $-102.1$  dBm [21]. The experimentally measured noise floor of the ADC with the detector off, DDS off, and laser diode sources off was  $-89.6$  dBm. The full scale voltage value for the ADC is 800 mV peak to peak which corresponds to a power of 2.0 dBm in a  $50 \Omega$  system. The dynamic range of the ADC is therefore 91.6 dB. This compares to a dynamic range of 120 dB for the network analyzer system. The noise floor of the

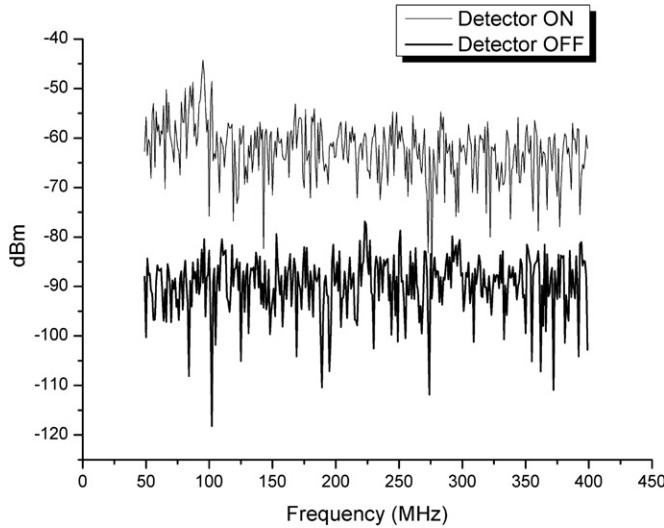


Figure 3. Noise floor.

system averaged over all modulation frequencies between 50 and 400 MHz with the detector on, laser diodes on, DDS on, and laser diode driver on but without source fibers connected was  $-62.9$  dBm. Example noise floor measurements for the 814 nm diode are shown in figure 3. The noise floor for the network analyzer laser system with the same detector was approximately  $-70$  dBm.

#### Amplitude and phase resolution, precision, and accuracy

Amplitude and phase resolution for the digital system is dependent on a multitude of factors including the bit depth of the ADC, the signal strength (i.e. the percent of full scale), the parameters of the FFT (sample length, window type), and the signal-to-noise ratio. The maximum (i.e. best) theoretical amplitude resolution of the digital system when only quantization of the ADC is considered, is the full scale voltage range  $E_{\text{FSR}}$  (800 mV in this case) divided by the number of discrete values available to the ADC:

$$\text{ADC amplitude resolution (volts)} = \frac{E_{\text{FSR}}}{2^n - 1} \quad (1)$$

where  $n$  is the bit depth. This is 0.195 mV for this 12-bit system and the corresponding maximum amplitude resolution is 0.024%. We define here the phase resolution to be the smallest change in an analog sine wave phase guaranteed to change the ADC output code at a single time point. The theoretical phase resolution for a sine wave is dependent on what part of the cycle the sine wave is sampled. For example, phase resolution will be poor if sampled only at the peaks and troughs due to the lower slope of the time-varying signal here (i.e. a large phase shift will be required to produce a change in the ADC output code). The phase resolution of a sine wave is then a mapping of the amplitude resolution into phase. The time dependent voltage signal  $V(t)$  is given by

$$V(t) = \frac{1}{2}E_{\text{FSR}}\sin(2\pi ft). \quad (2)$$

The phase resolution  $\varphi_r$  is then given by the amplitude resolution (equation (1)) divided by the slope of  $V(t)$ ,

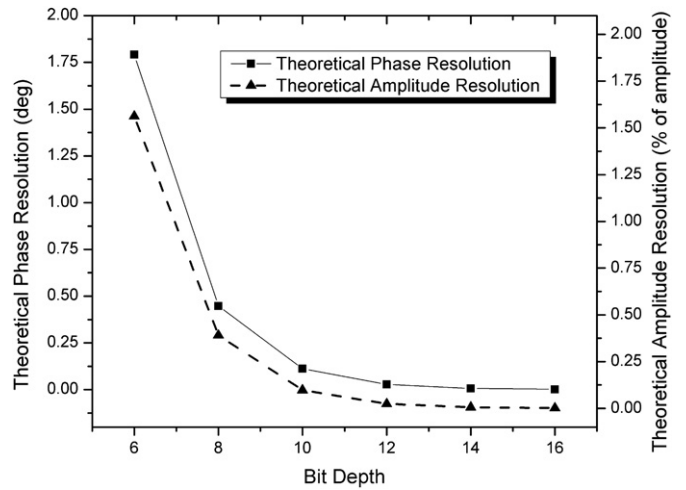


Figure 4. Theoretical phase and amplitude resolution for ADCs of different bit depths.

multiplied by the change in phase of the signal per unit time given by  $360^\circ f$ . After cancelling terms:

$$\varphi_r(t) = \left| \frac{360^\circ}{(2^n - 1)\pi \cos(2\pi ft)} \right|. \quad (3)$$

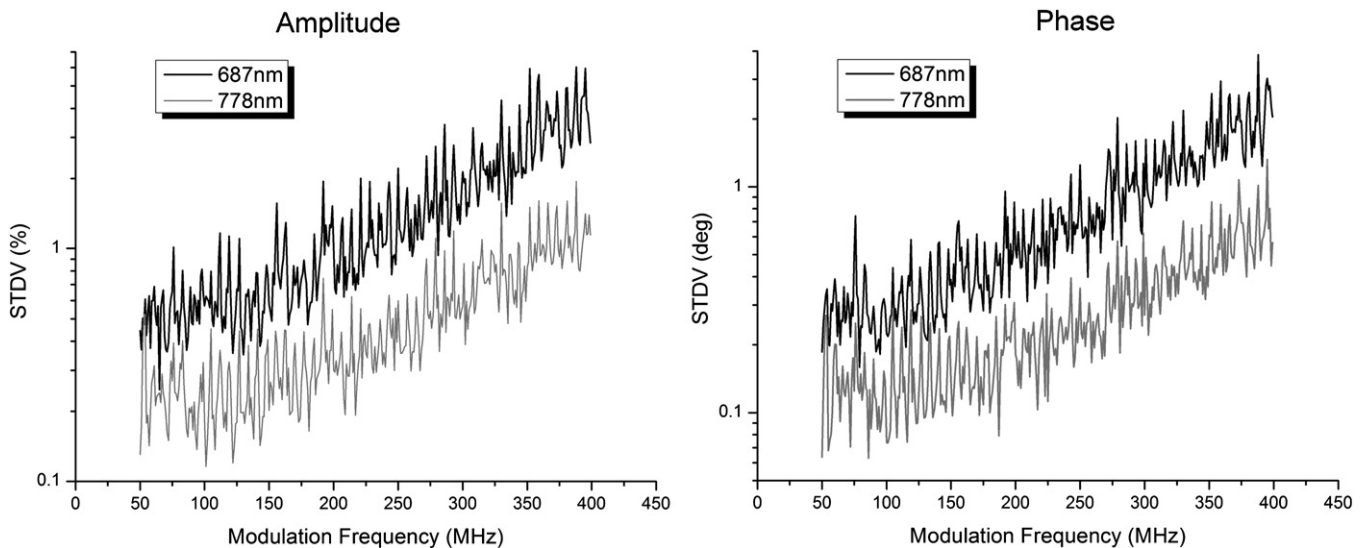
The maximum phase resolution  $\varphi_{r,\text{max}}$ , obtained when the cosine function is equal to 1, is given by

$$\varphi_{r,\text{max}} = \frac{360^\circ}{(2^n - 1)\pi}. \quad (4)$$

The maximum phase resolution for this system, for a full-scale signal, is  $0.028^\circ$ . Amplitude and phase resolution drop precipitously with decreasing signal levels or bit depth and this relationship is shown in figure 4.

Amplitude and phase precision for the digital system were measured by a 20 min drift test with 20 repeat measurements on a breast-like silicon optical phantom. A 10 mm source-detector separation was used with fiber-coupled sources and detectors as described in the methods section. Amplitude precision is defined per laser diode wavelength and per modulation frequency as the standard deviation (represented as a percentage of the mean) of the measured amplitude over the duration of the drift test. Phase precision is the standard deviation (represented in degrees) of the measured phase. Note that the amplitude referred to for these calculations is the ratio of the amplitude measured in the sample channel over the amplitude measured in the reference channel. The phase referred to is the difference in phase between the sample and reference channels.

Figure 5 shows example drift results from two laser diodes, the 687 nm and the 778 nm diodes. Note that the amplitude and phase precision both decrease with increasing modulation frequency. This effect can be attributed in large part to the fact that the amplitude of the measured signal decreased with modulation frequency due to the reduced RF power output characteristics of the DDS at higher frequencies, the lower response of the detector at higher frequencies, the reduced modulation depth of the laser diodes at higher frequencies due to internal capacitance, and the tendency of diffuse media to act as a low pass filter. For example, the measured signal



**Figure 5.** Experimentally determined phase and amplitude precision at 687 and 778 nm.

in the sample channel for the 778 nm diode occupied 75% of full scale at 50 MHz but only 6.6% at 400 MHz. When the signal occupies a smaller portion of the ADC's full scale, the amplitude and phase resolution decreases leading to larger variations over repeated measures. Finally, the total harmonic distortion (THD) of the ADC increases and signal-to-noise (SNR) decreases with increasing frequency reducing the effective number of bits (ENOB) which also contributes to larger errors at higher frequencies.

The amplitude precision averaged over all laser diode wavelengths and modulation frequencies (50 to 400 MHz in 1 MHz steps) was 1.02%. The phase precision was 0.59°. These errors translated into a precision of 1.5% in the measured absorption coefficient and 0.5% in scattering. The same drift experiment was conducted using the network analyzer-based system with an average amplitude precision of 0.30% and a phase precision of 0.13° resulting in a precision of 0.68% for absorption and 0.29% for scattering.

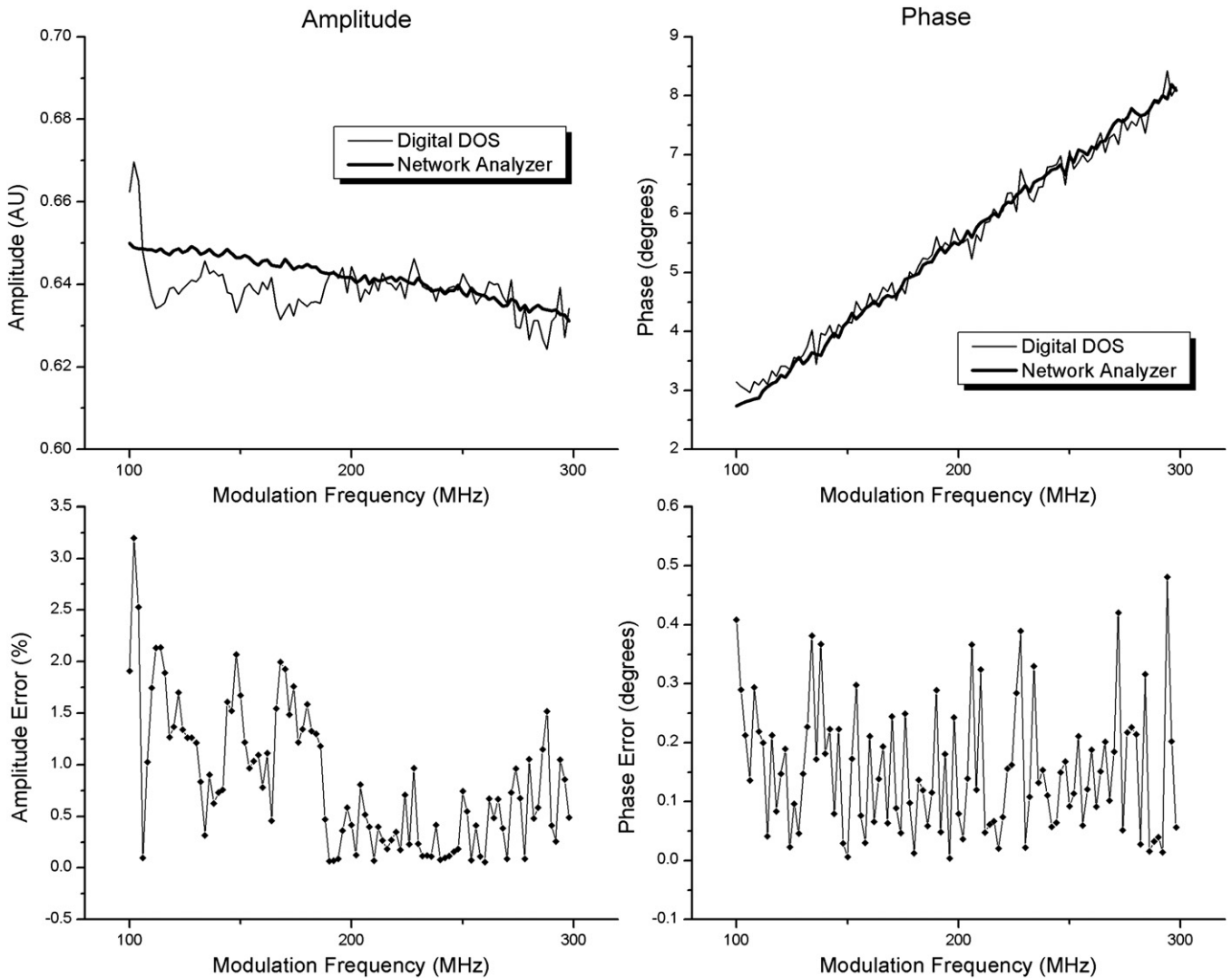
Amplitude and phase accuracy were determined by comparing measurements taken with the digital system and the network analyzer system on the liquid phantom ph3. The amplitude ratio and phase difference between 10 mm and 8 mm source–detector separation measurements were used to compare the two devices. Amplitude accuracy is defined here as the absolute % difference between the digital system and network analyzer system measurements per modulation frequency. The phase accuracy is defined as the absolute difference, in degrees, between the digital system and network analyzer system measurements per modulation frequency. Because the digital system and the network analyzer based system collected measurements at slightly different modulation frequencies (the digital system every 2 MHz and the network analyzer system every 0.75 MHz), linear interpolation was used to obtain phase and amplitude measurements from the network analyzer system at equivalent frequencies to the digital system.

Figure 6 shows amplitude and phase measurements from both devices at 778 nm along with amplitude and phase

errors. In this example, and for all other laser diodes tested, there was no identifiable frequency dependence on phase or amplitude accuracy. The amplitude accuracy averaged over all laser diode wavelengths and modulation frequencies (100 to 298 MHz in 2 MHz steps) was 1.44% and the phase accuracy was 0.32°. Accuracy averaged over only lower frequencies (100–126 MHz) was 1.61% and 0.30° for amplitude and phase respectively. Accuracy averaged over only higher frequencies (272–298 MHz) was 1.58% and 0.51°. Noise levels were likely sufficiently high to mask the frequency dependence on accuracy.

#### *Determination of optical properties*

In order to determine the ability of the digital system to extract optical properties from biologically-relevant diffuse media, a series of liquid optical phantoms were measured with both the digital system and the network-analyzer based system and results were compared using Bland–Altman analysis [22]. Five optical phantoms were created with a range of absorption and scattering values shown in table 1. Phantoms were measured with four different source detector separations (8, 10, 12, 14 mm). Optical properties were calculated for both systems using a multi-distance version of the diffusion-based processing code. The average difference between recovered optical properties was 3.6% (SD 3.8%) for  $\mu_a$  and 2.8% (SD 2.0%) for  $\mu_s$ . Figure 7 shows Bland–Altman plots of recovered optical properties for all phantoms at the six different laser diode wavelengths. All but three measurements for absorption (90% of measurements) and one measurement for scattering (97% of measurements) were within 1.96 SD of the mean difference indicating a close correspondence between measurements. Based on these data, we can expect absorption values measured with the digital system to be up to 0.0006 mm<sup>-1</sup> below or 0.0005 mm<sup>-1</sup> above values obtained using the network analyzer system. Scattering from the digital system maybe be up to 0.04 mm<sup>-1</sup> below or 0.04 mm<sup>-1</sup> above values obtained from the network analyzer system. The mean differences between systems are uniformly close to zero,



**Figure 6.** Accuracy of digital system. Amplitude and phase measurements are shown for both the digital and the network analyzer system for the 778 nm laser diode.

**Table 1.** Optical properties of liquid phantoms.

$\lambda$ (nm)	$\mu_a$ (mm <sup>-1</sup> )					$\mu_s$ (mm <sup>-1</sup> )				
	ph1	ph2	ph3	ph4	ph5	ph1	ph2	ph3	ph4	ph5
656	0.0062	0.0142	0.0097	0.0089	0.0095	0.98	1.07	1.10	0.61	0.68
687	0.0055	0.0125	0.0083	0.0073	0.0078	0.89	0.89	0.92	0.57	0.65
778	0.0040	0.0082	0.0055	0.0047	0.0048	0.72	0.70	0.72	0.41	0.45
814	0.0036	0.0075	0.0051	0.0038	0.0040	0.64	0.60	0.68	0.39	0.43
824	0.0034	0.0069	0.0048	0.0038	0.0038	0.65	0.62	0.65	0.43	0.45
852	0.0043	0.0075	0.0059	0.0049	0.0047	0.66	0.65	0.71	0.40	0.44

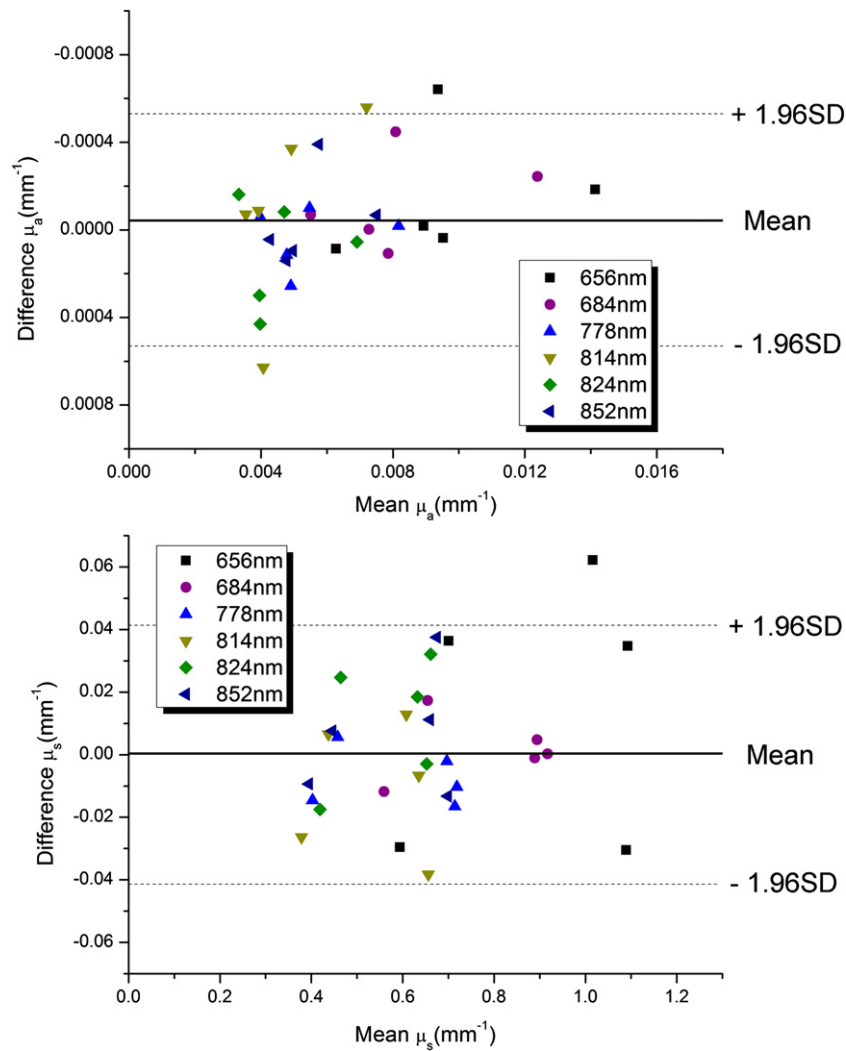
indicating that the digital system is not biased toward higher or lower values.

**Discussion**

Although direct comparisons with other published instruments are difficult due to differences in experimental setup, the amplitude and phase precision and accuracy for the digital system (1.02% and 0.59° precision, 1.44% and 0.32° accuracy) was comparable with other frequency domain optical systems

used for biological applications in which these parameters were documented, most of which are approximately 1% for amplitude and 1° for phase [7, 18–20].

The agreement between the digital system and the analog network-analyzer based system in extraction of optical properties was within 4%. Additionally, the absorption and scattering precision measured during drift tests was approximately 1.5% and 0.5% respectively. These performance parameters should allow for a broad range of useful biomedical applications. In the field of breast cancer



**Figure 7.** Bland–Altman plots of mean and difference of extracted  $\mu_a$  and  $\mu_s$  from the digital system and the network analyzer based system.

for example, average increases of approximately 60% (at 650 nm) or more in absorption have been documented in tumor measurements compared to surrounding normal tissue [23]. As another example, during a typical arterial cuff occlusion taken with the cuff on the upper arm and diffuse optical measurements taken on the forearm, our group measures changes of 13% (785 nm) to 75% (657 nm) in absorption. These contrasts are significantly larger than the measurements uncertainty of the digital system.

The measured precision of the digital system decreased with increasing modulation frequency. Precision and accuracy are dependent on the amplitude of the detected signal in relation to full scale and for this system, the amplitude of the signal greatly decreased with increasing modulation frequency. The average amplitude and phase precision at 50 MHz was 0.28% and 0.17° for example, but decreased to 2.4% and 1.5° at 400 MHz. This relationship can also be seen in figure 4 which shows bit depth/signal strength versus theoretical resolution. Both amplitude and phase resolution, accuracy, and precision will be affected by nonlinearities and jitter in the ADC, the FFT transform length and windowing function, and external noise. Furthermore,

imperfect quantization and distortion of the analog signal by the ADC reduces the effective number of bits (ENOB) collected by the system. For this ADC chip, the ENOB is specified by the manufacturer as approximately 9 at 100 MHz in the specific mode of operation.

Amplitude and phase precision could potentially be improved by increasing the measured signal amplitude at higher modulation frequencies. This could be accomplished by increasing the RF input power at higher frequencies, using a detector with higher bandwidth (the 3 dB rolloff for the 3 mm APD used in the study was ~80 MHz), or by amplifying the detected signal at higher frequencies. These solutions may introduce additional problems however. For example, there are limits to the extent that RF power to the laser diodes can be increased before clipping occurs. Higher bandwidth APD’s generally have smaller active areas which will limit the ability to detect low signal levels. Additional amplification on the detection side will introduce noise that may limit precision.

Interestingly, the measured accuracy did not have an observable frequency dependence. This is likely because system noise dominated over this relationship for the measured modulation frequencies.



Current limitations of the experimental setup include relatively slow measurement times and a relatively large instrument footprint. A single wavelength frequency sweep between 50 and 400 MHz in 1 MHz increments takes approximately 30 s due to communication and data transfer speeds using multiple USB port controls. The acquisition speed can be vastly improved by controlling the DDS and ADC closer to the hardware level instead of through several software layers and USB connections. For this feasibility study, evaluation boards, a benchtop current supply, and benchtop laser diode mounts were used. Significant reductions in instrument footprint will occur by integrating these components at the board-level. These improvements are underway.

The choice of ADC will significantly affect performance and capabilities of frequency-domain measurements. Currently, 12-bit direct digitizers are limited to several gigasamples/s which allow measurements up to several hundred MHz while staying within the Nyquist sampling criteria. 10-bit digitizers are significantly faster allowing for sampling of GHz signals but phase and amplitude resolution will be lost due to the lower bit depth (see figure 4). We have demonstrated in this manuscript that a reduction in amplitude, especially at higher frequencies, greatly reduces phase and amplitude precision suggesting that 10-bit digitizers may be viable only if signal levels are maintained close to full-scale.

No other groups have demonstrated the direct digital sampling method presented here for diffuse optical frequency domain measurements, although digital techniques are increasingly being utilized in this arena. Colyer *et al* have utilized a related digital frequency domain approach for fluorescence lifetime imaging (FLIM) microscopy [24]. Flexman *et al* have utilized digital signal synthesis and detection for continuous-wave measurements using low-frequency (5 or 8 kHz) lock-in detection for noise rejection and simultaneous multi-wavelength illumination [25, 26]. Other groups use lower speed ADCs to sample the IF in heterodyne detection [12, 15].

We have demonstrated the use of direct digital sampling for frequency domain optical measurements. This digital system can be constructed using off-the-shelf components for a fraction of the cost of a network analyzer based system. The use of digital technologies should provide opportunities to reduce instrumentation costs, reduce instrument footprints, and improve wavelength multiplexing schemes.

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