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Abstract. Fiber photometry uses genetically encoded optical reporters to link specific cellular activity in stereotaxically targeted brain structures to specific behaviors. There are still a number of barriers that have hindered the widespread adoption of this approach. This includes cost, but also the high-levels of light required to excite the fluorophore, limiting commercial systems to the investigation of short-term transients in neuronal activity to avoid damage of tissue by light. Here, we present a cost-effective optoelectronic system for in vivo fiber photometry that achieves high-sensitivity to changes in fluorescence intensity, enabling detection of optical transients of a popular calcium reporter with excitation powers as low as 100 nW. By realizing a coherent detection scheme and by using a photomultiplier tube as a detector, the system demonstrates reliable study of in vivo neuronal activity, positioning it for future use in the experiments inquiring into learning and memory processes. The system was applied to study stress-evoked calcium transients in corticotropin-releasing hormone neurons in the mouse hypothalamus. © 2018 Society of Photo-Optical Instrumentation Engineers (SPIE) [DOI: 10.1117/ 1.NPh.5.2.025006]

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Introduction 1

In awake, freely moving animals, the neural recording modality of fiber photometry has become an important tool in identifying correlates of behavior. Fiber photometry has been used in mice to investigate sound-activation in the auditory cortex,¹ transients in neural activity involved in the initiation of action,² social interaction,³ and risk-taking.⁴

Engineering advances in the instrumentation include its integration with established methodologies such as electrophysiology⁵ to supplement the recording with a readout reflective of the "natural language" of neurons. Correction for extraneous transients caused by motion is achieved with multiple light sources and/or detectors.⁶ The ability to monitor several brain structures simultaneously with optical tools is achieved⁷ by implanting multiple fiber probes. Pashaie and Falk⁸ explored the concept of simultaneous control and monitoring by integrating optogenetic stimulation and fiber photometry in a single optical fiber probe.

These improvements enable neuroscientists to better identify, explain, and cause rapid transients in neural activity that correlate with behavior in real-time. However, there are comparatively fewer studies of slow changes in neural activity that engage in long-term and repeated photometric measurements across weeks and months. Such studies would deepen our understanding of the processes that underlie learning, memory, disease progression, and long-term or permanent changes in normal or pathological behavior. We approached the problem of adapting fiber photometry to long-term and repeated optical measurements of neural activity by designing an optoelectronic system for fiber photometry that avoids exposing tissue to levels of light that are known to damage the optical reporter or the tissue. To avoid photobleaching in GFP-derived reporters such as GCaMP6s, excitation irradiances lower than 31.83 μ W mm⁻² are required (1 μ W for 200 μ m-diameter probes).⁹ The level of input excitation light that causes phototoxicity has received less attention, but is assumed to occur at higher levels.¹⁰

The proposed design is based off of a custom lock-in amplifier (LIA) and was applied to experimentally investigate models of fluorescence detection in a scattering phantom, and in vivo, to investigate the correlates of stress. The design presented here marks a significant improvement over similarly specified designs¹¹ in cost-efficacy and excitation power requirements, which will lower the barrier to widespread adoption of fiber photometry. The proposed system will henceforth be referred to as the cost-effective, in vivo, customizeable, low-light, fiber photometry system (CICLoPS).

This paper is organized as follows: Sect. 2 presents the design of the optoelectronic system and its subsequent characterization, and investigation of the collection profile of an optical fiber. Section 3 discusses the system's application to measuring calcium transients and its performance comparison to a commercial system.

2 Methods and Results: Optoelectronic System Design and Characterization

The photometry system design uses a modulated light-emitting diode (LED) as a light source, and a photomultiplier tube (PMT)

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is used as a detector. A custom LIA achieves coherent detection of optical signals. The LIA is implemented on a printed circuit board (PCB). These design choices drastically reduce the cost and complexity compared to ultrasensitive photometry systems proposed by others.¹¹ The reporter for which this design is optimized is GCaMP6s,¹² expressed in corticotropin-releasing hormone (CRH) neurons of the paraventricular nucleus of the hypothalamus (PVN) of a CRH-iresCre mouse. PVN CRH neurons are responsible for launching the endocrine response to stress and contribute to distinct behavioral repertoires after a stressful event.¹³

Full design documentation, assembly instructions, and a troubleshooting guide are available at a Github repository.¹⁴

2.1 Optical System

Figure 1(a) shows the delivery and collection paths for excitation and emission light in the fiber photometry system. To prepare the light source, the lens of an LED centered at 465 nm (LXML-PN02, Lumileds) was removed through gentle application of heat to expose the semiconductor die. The LED was soldered on a round board and mounted in a 1-in. lens tube. Coupling of the excitation light was achieved through collimation of the light with a lens (AC127-019-A, Thorlabs), employment of an excitation filter (470/40 nm, Chroma Technology), and a dichroic mirror (495LP, Chroma Technology) to direct the excitation light toward the coupling lens (F240FC-532, Thorlabs) for launching the excitation light into the optical fiber.

The modulated LED driver is realized using an operational amplifier (OPA171, Texas Instruments), the schematic for which is shown in Fig. 1(b), top. The noninverting terminal of the op amp is supplied with the modulation voltage waveform from a data acquisition card (USB-6361, National Instruments) running a custom C++ continous output voltage routine for a 9-V amplitude sine wave. This signal is copied to the inverting terminal and along with the -12 V reference voltage causes a sinusoidal current through the resistor. This current is forced through the LED, generating near-sinusoidal optical output in phase with the modulating signal. Parameters of the modulation are controlled by changing the sine wave. Using a 39-k Ω resistor, the average power at the output of the 200- μ m optical fiber to 100 nW. The stability of the light source was investigated through

a 15-min continuous recording at the output of the optical fiber with a power meter (PM100, Thorlabs). Figure 1(b), bottom panel depicts the acquired, filtered trace. The drift in the excitation power over time as measured at the output of the fiber was found to be $1.12 \ \mu W/W/s$.

Emission photons generated by the sample are collected by the optical fiber tip and guided back to the optical system for detection by a PMT (H10771-40P, Hamamatsu). These photons pass through the dichroic, and an emission filter (515/30 nm, Chroma Technology). The beam is then focused to lie within the photocathode with a third lens (AC254-040-A, Thorlabs). A 515/30 filter was used in place of the application of a wider 525/50 emission filter⁶ as it was found that spurious photons from standard fluorescent room lighting were strong at 543 nm, and were ultimately being collected by the implanted optical probe. Though coherent detection attenuates these incoherent photons, they may introduce nonlinearities due to the limited dynamic range of the PMT. This effect is undesired and was eliminated with the alternate filter choice, but could also have been solved with a thicker application of dental cement used to secure the implant probe, alternate room lighting choices, or reduced PMT gain.

The optical design was realized with modular optomechanical components, shown in Fig. 1(c). A 0.48-NA, 200- μ m diameter optical fiber was selected. While larger diameter probes (400 μ m in photometry and 600 μ m for deep-brain imaging applications) have been implanted in freely moving mice, we selected the small diameter for application in popular animal models such as mice, as 300 μ m is considered a conservative safe upper limit for small rodents.¹⁵

2.2 Lock-in Amplifier and Electronics

Coherent detection provides immunity to uncorrelated noise sources by modulating the excitation of an experiment at some carrier frequency, f_c , and then using a mixer and steep electronic filter to measure the amplitude of the resulting signal. Because white noise is, by definition, uncorrelated with any deterministic signal, employing such a detection scheme lowers the noise floor of a given system. In addition, modulating at f_c shifts the signal away from DC and the 1/f noise that is strongest at low frequencies. The result is increased sensitivity.



Fig. 1 Optical setup employed for the fiber photometry system. (a) Light path showing LS, LED light source; EX, excitation filter; DBS, dichroic beam splitter; FO, optical fiber tether; SH, shutter; EM, emission filter; PMT, photomultiplier tube detector; and L_1 , L_2 , L_3 , collimating or focusing lenses. (b) (top) LED driver schematic for light source. (bottom) Light source power output recording during a 15-min period. Slow deviations from the mean excitation output power in the light source is $1.12 \ \mu W/W/s$. (c) Photo of the optical system that realizes the specified light path with modular optomechanical components.



Fig. 2 Block diagram of proposed custom LIA to realize coherent detection scheme. DAQ, data acquisition card; PMT, photomultiplier tube; and TIA, transimpedance amplifier.

These "alternating current techniques," in the form of lock-in amplification, are therefore widely used in low-level optical detection applications¹⁶ including fiber photometry.^{3,8,11} Commercial LIAs are suitable for such applications, but are expensive and have additional functionality beyond what is required. We propose a cost-effective system that, as will be shown, also enables detection of calcium transients at light levels suitable to avoid photobleaching.

Figure 2 shows the schematic of the proposed design for monitoring low-level fluorescence *in vivo*. As explained in Sec. 2.1, a LED is an inexpensive light source that was chosen for this application because its power output is proportional to the current flowing through the device, enabling it to be easily modulated. The fluorescence generated coherently with the excitation of the tissue is detected by the PMT. The modulated photocurrent from the PMT is then transformed to a voltage signal by a transimpedance amplifier, in which the measured signal value is proportional to the feedback resistance. The noise in the transimpedance amplifier is dominated by Johnson noise, which increases with the square root of this resistance. The resultant SNR is therefore proportional to the square root of the transimpedance gain, according to

$$SNR = \frac{|I_{PMT}|R_f}{\sqrt{4kTBR_f}},$$
(1)

where SNR is the signal-to-noise ratio of the transimpedance amplifier output, I_{PMT} is the input current signal, R_f is the magnitude of transimpedance gain, k is the Boltzmann constant, T is the absolute temperature, and B is the amplifier bandwidth. To maximize the SNR, the PMT current and the transimpedance gain should be as high as possible. However, since the coherent detection scheme used can not tolerate large distortions, the PMT must be used in its linear range, under 100 nA. With that constraint, R_f and the amplifier's power supply were chosen to be 100 M Ω and ± 12 V, respectively.

The operational amplifier (AD8065, Analog Devices) used in the front-end transimpedance amplifier was chosen for its low input bias current (1 pA), its ability to operate at the selected power supply, and for its wide gain-bandwidth product (145 MHz). Following analysis by Jung,¹⁷ the amplifier's phase margin was found to be 89 deg at the unity loop gain frequency, well above the 45 deg recommended for stability. The $f_{3 dB}$ bandwidth of the amplifier, that will inform the decision on modulation frequency, is then given as¹⁸

$$f_{3\,dB} = \sqrt{\frac{\text{GBW}}{2\pi R_f(C_i + C_f)}} \sqrt{1 + \frac{1}{2Q^2} \left(\sqrt{1 - 4Q^2 + 8Q^4} - 1\right)},$$
(2)

where quality factor $Q = \frac{\sqrt{\frac{\text{GBW}}{f_z}}}{1+\frac{\text{GBW}}{f_p}}$. $f_{3 \text{ dB}}$ is predicted to be 5.32 kHz with input capacitance $C_i = 20$ pF, feedback capacitance $C_f = 0.3$ pF, feedback resistance $R_f = 100$ MΩ, input resistance $R_i = 1$ TΩ, and gain-bandwidth product GBW = 145 MHz. f_z and f_p , the zero and pole frequencies of the noise-gain function, were found to be 7.84 Hz and 5.31 kHz, respectively.

A second-order, 5 kHz Sallen–Key filter¹⁹ was realized to provide further band limitation of the incoming modulated signal. The total frequency response was then determined experimentally with an LIA (SR860, Stanford Research Systems). The TIA's measured cut-off frequency, $f_{3 \text{ dB}}$, was 1.95 kHz, and the gain was found to be 160 dB Ω . The discrepancy in achieved bandwidth compared to theoretical bandwidth can be explained with larger parasitic capacitance (0.8 pF) in the realized circuit than assumed during design (0.3 pF).

Subsequent design choices were informed by the kinetics of the calcium reporter, GCaMP6s. Calcium transients reported by GCaMP6s are characterized by slow changes in fluorescence intensity.¹² Treating this as a first-order system, the bandwidth (BW) of this signal was estimated from the reported rise times, τ_{rise} , in the optical signal due to an action potential detected in mouse visual cortex *in vivo*¹² using

$$BW = \frac{0.35}{\tau_{rise}}.$$
(3)

This yielded a bandwidth of 1.95 Hz. Optical transients measured from populations of active neurons would be slower, depending on the degree of synchronous activation.

In this topology, the same reference signal for driving the light source was used to perform demodulation. A modulation frequency of 211 Hz was selected for this purpose, to avoid powerline harmonics at multiples of 60 Hz (in North America). This modulation frequency is high enough to accommodate the calcium signal bandwidth. A multiplier integrated circuit (AD734, Analog Devices) performs the frequency mixing. A fourth-order, 10 Hz Sallen–Key Butterworth filter was designed to low pass filter the frequency-shifted signal, which entirely captures the calcium transient signals.

The modulation and demodulation circuits were implemented on the same PCB. ± 12 V was supplied by low-dropout regulators [MC7812 (+12 V) and MC7912 (-12 V), ON Semiconductor] each in turn supplied by two—9 V batteries connected in series to avoid power line noise. The total input-referred noise in the 0.1 to 10 Hz band was measured to be 7.62 fA (RMS). Using spacers, the PCB was mounted inside a $1.625'' \times 1.5'' \times 1.5''$ aluminum enclosure. BNC connecters were secured for the LIA inputs $[v(t)_{\text{MOD}}$ and $i(t)_{\text{PMT}}$] and output $[v(t)_{\text{LIA}}]$. A custom C++ program running a data acquisition card (USB-6361, National Instruments) supplies $v(t)_{\text{MOD}}$ and saves samples of $v(t)_{\text{LIA}}$ at 100 samples per second to. bin files. These files are read by custom MATLAB[®] scripts.

2.3 Collection Efficiency with Probe-Structure Separation

Single-fiber photometry for neural recording involves implanting an optical fiber probe in tissue such that it can collect fluorescence emitted from genetically targeted populations. Stereotaxic coordinates of the mouse brain model,²⁰ together with landmarks on the skull that serve as a reference, are used to predict the location of the structure in the brain for targeting of the probe. However, variability between animals cause the predicted coordinates to deviate from the actual coordinates, leading to improper placement of the probe. The challenge is compounded by the scattering of visible light by brain tissue: the optical fiber probe must be implanted very close to the population of cells to ensure delivery of excitation photons, and collection of emission photons from the structure of interest. Whereas, ideally, the probe tip would be placed as close as possible to the population of genetically targeted fluorescent cells, without crushing the cells of interest, it is much more likely that the probe tip is separated from the cells by some distance. This impedes the ability to detect and quantify transients in fluorescence intensity.

Figure 3(a) shows the ideal (perfect) and likely (imperfect) cases of probe placement resulting from implantation and illustrates how the ability to collect this fluorescence is reduced when the structure and the probe are separated. The natural loss of irradiance with distance from a source of finite size, as well as the scattering of light by tissue, reduces the number of photons that will be collected by the probe. Knowledge of the effect of probe parameters and placement on the ability to

detect and quantify transients in fluorescence intensity would enable improved signal collection efficiency through application-specific probe design and surgical protocols. Moreover, a quantitative understanding of the ability to detect transients in fluorescence intensity from populations of genetically targeted cells in tissue will support subsequent histological assays to determine the cause of those transients in fluorescence.

The bidirectional process of delivering and collecting illumination from tissue with an optical fiber has been studied through the application of numerical methods for tissue oxygen saturation,²¹ and for fluorescence from single neurons with singlemode fibers.⁵ The collection volume of an optical fiber probe in tissues for detection of endogeneous fluorophores has been investigated both experimentally and through the development of mathematical models.²² Closed-form solutions for collection efficiency from fluorescent structures⁸ have been proposed; however, experimental validation is lacking.

We approached the problem of providing intuition for collection of fluorescence from arbitrary structures by developing and experimentally validating mathematical models. The analysis is adapted from a model of gradient-index, single mode fibers⁵ for quantifying the collection profile of a step-index, multimode fiber while taking into account scattering. Beginning with the ability to detect fluorescence from a fluorescent point source Q(x, y, z) in front of the probe with a multimode fiber, the analysis then explores the collection of fluorescence from arbitrary spatial distributions of fluorescence by evaluating the appropriate integral.

Figure 3(b) shows the collection of fluorescence from a point source Q(x, y, z) by a differential surface dS located at point



Fig. 3 (a) Fiber photometry involves implanting an optical probe near a spatially clustered population of genetically targeted fluorescent cells. (a) Left: Perfect implantation: ideally, the probe tip will be placed as close to the structure as possible without crushing the cells of interest. Right: Imperfect implantation: due to variability between animals, the actual coordinates of the population differ from those predicted using stereotaxic landmarks alone. The result is some combination of axial and transversal displacement that reduces the collection efficiency. (b) Collection of photons due to fluorescence from a point source *Q* at (*x*, *y*, *z*). The fluorescence is collected by the set of differential surfaces on the optical fiber tip d*S* = dxdy separated from *Q* by d_1 . (c) Measured and modeled collection profiles from a fluorescent strip with radial displacement, with probe tip positioned at $z = 50 \ \mu m$. (d) Collection profile with axial displacement.

 (x_p, y_p) on the tip of the optical fiber probe. The total power collected, P_c depends on the local excitation intensity at that point, $I_{ex}(x, y, z)$, and the emission coupling efficiency between the point source and the detector, $C_m(x, y, z)$

$$P_c = \iint_{\text{fiber core}} I_x(x, y, z) C_m(x, y, z) dx \, dy.$$
(4)

The beam that emerges from the optical fiber was assumed to depend solely on the numerical aperture of the optical fiber and the refractive index of the medium in which the fiber was immersed. With intensity I_o and waist w_o at the tip of the probe (here assumed to be radius of the optical fiber core r_f), and radius w(z) at distance z from the tip for fiber with acceptance angle θ_a , the intensity of excitation at a point (x, y, z) in a scattering medium characterized by reduced scattering coefficient μ'_s is given by $I_x(x, y, z)$

$$I_{x}(x, y, z) = I_{o} \frac{w_{o}^{2}}{w(z)^{2}} \left\{ 1 - \frac{1}{1 + e^{-\left[\sqrt{x^{2} + y^{2}} - w(z)\right]}} \right\} e^{-\mu_{s}' z},$$
(5)

where $w(z) = w_o + z \tan \theta_a$. The $\frac{w_o^2}{w(z)^2}$ term accounts for the reduction in local excitation intensity from initial intensity I_o at z = 0 due to the divergence of the beam with depth z, the second term approximates the spatial constraint of the excitation within the x - y plane as a two-dimensional sigmoidal function, and $e^{-\mu'_s z}$ approximates the transmission fraction due to scattering, as z is assumed to be the distance traveled by most excitation photons.

The emission coupling fraction $C_m(x, y, z)$ approximates how many fluorescent photons are collected by the fiber. $C_m(x, y, z)$ is, in turn, determined by the fluorophore's quantum efficiency η and absorption cross-section A, the radial distance d_1 separating the point and dS, the angle θ made by the line connecting dS and Q with the z axis, specifically whether it lies within the acceptance cone defined by θ_a , in turn determined by the fiber's numerical aperture (NA).

$$C_m(x, y, z) = \frac{\eta A}{4\pi d_1} \left[1 - \frac{1}{1 + e^{-(\theta - \theta_a)}} \right] e^{-\mu'_s d_1},\tag{6}$$

where

$$\theta = \tan^{-1} \left[\frac{\sqrt{(x - x_p)^2 + (y - y_p)^2}}{z} \right],$$
(7)

$$d_1 = \sqrt{(x - x_p)^2 + (y - y_p)^2 + z^2}.$$
(8)

Integrating Eq. (4) over the fiber core then gives the total power collected by the probe due to a fluorescent point source.

We next computationally investigated the effect of transversal and axial displacement of optical probes near physiologically plausible fluorescent structures on the total collected optical power. We simulated the excitation and collection of fluorescence by the optical probe in front of neuronal populations, modeled as finite sheets of various dimensions, with numerical methods. We then experimentally investigated the dependence of axial and transversal displacement on the total power collected by an optical probe from a finite sheet of fluorescence in a scattering phantom. The numerical model was developed and tested for a 200 μ m optical fiber with NA = 0.48, exciting fluorophores at $\lambda = 475$ nm with $P_{ex} = 15$ nW emerging from the tip of the probe. The scattering coefficient was assumed equal for both excitation and emission photons. As 2% Intralipid was used as the scattering phantom for experimental work, the reduced scattering coefficient in the numerical model was set to 3.63 μ m⁻¹.²³

To explore the physical accuracy of the numerical model, green masking tape (89097-930, VWR) that exhibits fluorescence when exposed to the system's light source was cut into either 1-mm-diameter disks or 250-µm-width strips and placed at the bottom of a petri dish with a microscope slide at its base. The strip width was selected to enable probing of axial resolution of a structure approximately as wide as the optical fiber, and the disk diameter was selected to approximate the shape of small fluorescent neural population such as the CRH neurons of the hypothalamus of the PVN. The petri dish was filled with the 2% Intralipid solution and in turn suspended in a larger container filled with the same intralipid solution. This "double immersion" was employed to simulate the situation in vivo, in which a fluorescence structure is suspended in a larger volume of scattering medium. The tip of a polished optical fiber probe was then positioned appropriately using a three-axis stage.

Figures 3(c) and 3(d) show the dependence of the collection profile on radial and axial positioning of the probe with respect to a linear and planar fluorescence source. As expected, the collection of the probe is maximized when the probe is centered on the structure in the x - y plane (no radial displacement), and when axial separation is minimized. The collection efficiency is reduced to 50% when the probe is positioned with ~125 μ m radial displacement, or with 75 μ m axial displacement.

3 Methods and Results: In Vivo Application and Comparison with a Commercial Alternative

The proposed optoelectronic system was applied to investigate the role of hypothalamic PVN CRH neurons in the stress response. These cells were targeted to selectively express the calcium-reporter GCaMP6s. Observed changes in fluorescence intensity due to calcium transients reflect underlying changes in neuronal firing activity of these cells.²⁴

The CRH neurons of the PVN play an essential role in the neuroendocrine response to stress, which act on the order of minutes.²⁵ However, recent studies have found evidence that these cells also play a role in mediating complex, rapid behavioral responses following exposure to stress.¹³

3.1 Implantation Procedure

All the experiments were approved by the University of Calgary Animal Care and Use Committee in accordance with Canadian Council on Animal Care guidelines. In a stereotaxic apparatus under isoflurane anesthesia, glass capillaries were lowered into the brain of 6- to 8-week old Crh-IRESCre; Ai14 mice [anteroposterior (AP), -0.7 mm; lateral (L), -0.3 mm from the bregma; and dorsoventral (DV), -4.5 mm from the dura]. Recombinant adeno-associated virus (AAV) carrying GCaMP6s (AAV9-CAG-GCaMP6s-WPRE-SV40; Penn Vector Core) or enhanced yellow fluorescent protein (EYFP) (pAAV-EF1adouble floxed EYFP-WPRE-HGHpA; Penn Vector Core) was pressure injected with Nanoject II apparatus (Drummond Scientific Company) in a total volume of 210 nL. Animals were allowed to recover for 5 days and then handled for \sim 5 min daily for four consecutive days before all behavioral testing.

3.2 Photometric Data Acquisition and Analysis

The optical fiber was prebleached by 5 min exposure to 2 mW optical power prior to the experiments. This prebleaching reduces the optical fiber's ability to photobleach further.

Raw photometric data were first processed with a 0.5-Hz low-pass software filter and then transformed to changes in intensity as

$$\Delta F/F = \frac{F - F_o}{F_o} \times 100\%,\tag{9}$$

where F_o was computed from the mean intensity recorded during the first 100 s of the prebaseline recording.

Where applicable, changes in fluorescence intensity were further quantified using a measure of contrast-to-noise ratio, CNR, defined as the ratio of the difference in mean signal values between two time periods, to the quadrature-averaged standard deviation of the traces from the two time periods.

$$CNR = \frac{\Delta F}{N},$$
(10)

$$=\frac{\mu_2 - \mu_1}{\sqrt{\frac{1}{2}(\sigma_1^2 + \sigma_2^2)}},$$
(11)

where μ_1 and σ_1 are the mean and standard deviation of the fluorescence signal during the first time period, and μ_2 and σ_2 are the mean and standard deviation of the fluorescence signal during the second time period.

3.3 In Vivo Recording

Contextual fear conditioning occurs when an animal is placed in a new environment, exposed to an aversive stimulus, and then removed. Upon return to this context, the animal typically exhibits passive defensive behaviors (freezing). The animal remembers the last encounter with the environment and associates it with the bad experience. In other words, it has learned that the context is harmful. This paradigm is applicable here to help understand the role of CRH neurons in stress-mediated responses to conditioned fear. We delivered several footshocks (aversive stimulus) in a footshock cage (new environment). Upon reintroduction to the shock cage, the animal should exhibit changes in behavior due to memory of stress even in the absence of footshocks, and trigger the stress memory associated with increased CRH neuron activity and intracellular calcium concentration in those cells. This will be seen as increased fluorescence intensity in GCaMP6s animals, but no change in fluorescence detected in EYFP (control) animals.

The protocol used to investigate the neural correlates of conditioned stress is shown in Fig. 4(a). CRH-Cre mice transfected with either GCaMP6s (experimental) or EYFP (control) through viral injection, were implanted with fiberoptic cannula implants (MFC-200/230-0.48-5mm-MF2.5-FLT, Doric Lenses) on day zero, following the protocol developed by Cui et al.¹⁰ On day 10, the animal was subjected to a series of footshocks (0.5 mA for 2 s, 10 times in 5 min)¹³ delivered in the shockcage. On day 11, fiber photometry measurements were taken upon reintroduction to the shockcage without the shocks.

The photometry recording consisted of a 5-min baseline recording in the animal's home cage, a 6-min exposure to conditioned stress, and followed by a 5-min postrecording in the home cage again. For these experiments, the input excitation power, $P_{\rm ex}$, was 1 μ W.

Figure 4(b) shows representative traces of fluorescence intensity when animals were reintroduced to the environment in which they had been subjected to a footshock stress. Reintroduction of the GCaMP6s animals to the context in which they had previously experienced a stress resulted in increased fluorescence intensity with a close time-correlation to the duration of the stress (GCaMP6s: $CNR = 7.27\% \pm 1.47\%$, n = 3; EYFP: CNR = -0.249%, n = 1). These elevated levels of fluorescence were not seen in the control group. The trace obtained in the EYFP case does, however, exhibit large and rapid fluctuations in fluorescence intensity that may be due to artifacts of biological (such as hemodynamics) or nonbiological origin (movement and fiber bending).

3.4 Performance Comparison

We next sought to evaluate the system against other reported solutions. We applied it experimentally to a number of tasks alongside a popular commercially available alternative system. The alternative is based off of a Doric Lenses solution with a Tucker-Davison Technologies processor (RZ5), an appropriate system for comparison as it is also used in the application of recording GCaMP6s transients *in vivo*. The system used here was implemented as described in Supplementary Materials prepared by Lerner et al.⁶

We first investigated how performance compares between the two systems across their respective dynamic ranges, by recording over a range of excitation light conditions. A 3-nM solution of fluorescein was used as the source of fluorescence as this concentration was found to produce similar intensity to calciumsaturated GCaMP6s observed *in vivo*.

We then quantified how well the two systems can measure changes in fluorescence intensity *in vivo* using excitation powers that deliver similar SNR. To do this, we recorded the calcium activity in a CRH-iresCre GCaMP6s mouse upon transitioning to a new environment. As encountering a new environment increases arousal, CRH activity should increase for the duration of the encounter. We used both systems to capture separate segments of the recording, allowing a direct comparison of sensitivity between the two systems.

Finally, we applied both systems at their nominal excitation powers (CICLoPS, 100 nW; Doric, 30 μ W) to the task of detecting neural correlates associated with innate stress from a nociceptive stimulus. This involved recording from animals while delivering a series of 10 2-s, 0.5 mA footshocks.

Figure 4(c) shows the photon transfer curves, which plots noise versus signal on logarithmic axes, obtained from the two systems. The slope of this curve should be 0 in the read noise limited region and 1/2 in the shot noise limited region. The data points for each system are annotated with the input excitation power in μ W and resultant SNR in parentheses. The Doric-based solution exhibits read-noise limited behavior at lower excitation intensities but approaches shot-noise limited behavior at higher intensities. CICLoPS is nearly shot-noise limited over its entire dynamic range. The commercial system can achieve the high SNRs of CICLoPS but only at fairly high



Fig. 4 Response of GCaMP6s-targeted PVN CRH cells *in vivo* and results from performance comparison with a commercial system. (a) Experimental protocol following viral injection of the GCaMP6s vector, for which (b) representative traces from a GCaMP6s (green) and EYFP (orange) CRH-Cre mouse. Red bars denote transfer to or from the footshock cage that provides the conditioned stimulus. (c) Photon transfer curves for the two systems compared in this study were generated over a range of excitation powers appropriate to each system. Numbers indicate (power in uW, SNR). (d) Recording from a single GCaMP6s mouse using both systems to capture different segments of a continuous experiment. (Red bars denote transfer to or from a new environment.) (e), (f) detailed traces at transition times. Recordings made by the Doric solution at 30 μ W (orange, g) and CICLoPS at 100 nW (blue, h) during delivery of a series of footshocks. (i), (j) detailed traces during the footshock-delivery interval; black bars denote shock times (shock duration not to scale). CICLoPS offers similar performance as Doric at much lower excitation power leading to much lower photobleaching.

excitation powers. At 100 nW excitation power, CICLoPS produced an SNR of 231.

Figure 4(d) shows the changes in fluorescence intensity recorded from a CRH-iresCre GCaMP6s mouse transitioned from its home cage to a new environment and then returned to its home cage, using both systems to capture different segments of the recording. For the CICLoPS system, 100 nW was used, and for the Doric-based solution, 7.5 μ W. Recording first with the Doric solution operating at 7.5 μ W, a baseline recording was taken from the animal in its home cage for 10 min, then transitioned to a new environment at t = 10 min. At t = 13 min, the Doric system's excitation power was abruptly changed to 100 nW. At t = 15 min, the optical tether connector was switched to CICLoPS operating at 100 nW. The traces obtained from CICLoPS and Doric operating at 7.5 µW were transformed to changes in fluorescence intensity. No baseline measurement was obtained for the Doric solution at 100 nW. The trace depicted for the system operating at 100 nW was transformed to $\Delta F/F$ to match the % increase obtained for the system at 7.5 μ W just prior to switching to 100 nW.

A 4.1% increase was detected by the Doric solution at t = 10 min. This increase in fluorescence intensity was followed by a gradual decay, suggestive of photobleaching. The segment acquired with the Doric system operating at 100 nW did not cause photobleaching, but produced an SNR of just 6.3. As a result the Doric system was incapable of resolving the small increase in the fluorescence at 100 nW. The switch to CICLoPS with 100 nW excitation at t = 15 min showed an increase in fluorescence over the baseline and no evidence of photobleaching was seen. Finally, a decrease similar to the initial increase (3.7%) was seen at t = 18 min when the animal was moved back to the home cage.

Figures 4(g) and 4(h) show changes in fluorescence intensity recorded with the commercial alternative and CICLoPS from a mouse transitioned from its home cage to a new environment (at t = 8 min), subjected to a series of 10 footshocks at ~30 s intervals in that new environment, and then returned to its home cage (at t = ~18 min). The systems are operated at nominal excitation powers 100 nW for CICLoPS and 30 μ W for the Doric solution.

(a)	ΔF: 0.559	#2	#3 λF: 0.007	#4 ΔF: 0.142	45 β ΔF: -0.025	#6 ΔF: 0.071
(b)						
	Distance (μ m)					
Radial	60		240	90		20
axial	90		40	60		110
Corrected	ΔF : 1.556		ΔF : 1.03	ΔF : 0.331		$\Delta F: 0.221$

Fig. 5 (a) Identification of CRH neurons expressing GCaMP6s in the hypothalamic PVN of the hypothalamus of a mouse, and location of implanted fiber optical probe, 3V: third ventricle. The PVN is the cluster of fluorescent cells outlined in the micrograph for # 1. Scale bars: #1 100 μ m, #2 to 6 200 μ m (b) ΔF corrected for radial and axial probe misalignment using experimentally validated theoretical models of fluorescence detection in each animal.

Figures 4(i) and 4(j) show detailed traces during the shock delivery interval. Each footshock was followed by a rapid increase in fluorescence intensity of short duration, of amplitude $3.23\% \pm 0.51\%$ for CICLoPS and $5.23\pm 0.68\%$ for Doric. The recording made with the Doric system lost 7.51% of its intensity over the 28-min recording, but only a very small change (0.2% increase) was observed with CICLoPS system operating at 100 nW (as calculated with the mean intensities during the first and last 100 s of each recording). Nominal excitation light of the commercial system induces significant photobleaching, but 100 nW preserves signal fidelity.

While CICLoPS enables recording at excitation powers sufficient to avoid photobleaching, measurements with the CICLoPS configuration during the footshock stress were of lower responsivity than those obtained with the commercial alternative. As the experiments in the animal were conducted sequentially, it is possible that the neural response to nociceptive stimulus had fallen due to some habituation effect. The discrepancy may also be explained by the different emission filters employed between the two systems for this experiment: CICLoPS was configured with a 515/30-nm filter whereas the Doric solution employs a wider 525/50 nm filter. The autofluorescence of the optical fiber employed is stronger in the 515/30 nm band,²⁶ reducing the sensitivity to GCaMP6s transients.

These results show that CICLoPS can detect changes in fluorescence intensity *in vivo* with 100 nW of input excitation power. We have not seen any evidence of photobleaching at this light level. The Doric system could also be operated at this light level, but it is not clear what changes, if any, could be detected with the poor SNR produced (6.3). To improve the SNR, the excitation power has to be increased more than 10-fold to a few μ W, which then leads to photobleaching. This effect is pronounced in Fig. 4(g), where exposure to 30 μ W for 28 min resulted in a 7.51% reduction in fluorescence intensity.

3.5 CNR Correction

We next sought to investigate the ability of the theoretical models for fluorescence detection to correct for probe misplacement *in vivo* in photometry recordings. Figure 5(b) provides the results of a *post-hoc* correction on ΔF given the probe misplacement, using data from the contextual fear conditioning experiments, as estimated to the nearest 10 μ m and the measured ΔF . The analysis was performed only on those recordings that resulted in a positive ΔF , as those recordings that produced a negative ΔF are suggestive of dynamics in macroscopic tissue heterogeneities such as blood volume changes. The distance used to calculate the signal reduction due to axial and radial misplacement is the distance between the center of the probe as shown on the micrograph to the closest, bright object in the image. Bright objects were identified by thresholding a grayscale version of the original micrographs, and are annotated with a red circle in Fig. 5(a). The correction reduced the within-group variability for ΔF , suggesting evidence that application of the models can help uncover the true ΔF for nonideally placed probes.

4 Conclusion

In this work, a highly sensitive optoelectronic system for *in vivo* fiber photometry, and its application in awake, freely moving mice to interrogate the behavioral correlates of the stress response was described. The system was designed to detect changes in fluorescence from GCaMP6s in applications requiring low excitation light levels. Validation experiments were performed to experimentally investigate the computational models of collection efficiency of fluorescence in a scattering medium, to investigate calcium transients of CRH cells in mice in response to a conditioned stress, and to compare its performance to a commercially available alternative.

In vivo data revealed a distinction between the optical transients produced in GCaMP6s and EYFP (control) groups, suggesting that CRH neurons are indeed active during the re-exposure to the conditioned stress. CICLoPS was found to perform similarly with the commercially available alternative in a variety of in vitro and in vivo experiments at much lower excitation powers, although a reduction in sensitivity was revealed during the innate stress test due to habituation or different emission filters in the systems. Meanwhile, recording with the CICLoPS system did not induce photobleaching, whereas application of the Doric system, and particularly when operating at its nominal 30 μ W did show a decreasing trend in fluorescence intensity over the acquisition period. The application of the theoretical models of collection profile in tissue to in vivo data also shows promising, yet limited, ability to correct for misplaced probes. We believe the major limitation of the model lies in the assumption of tissue homogeneity, whereas the recorded traces show a likely susceptibility to changes in tissue

 Table 1
 Comparison of materials costs between the proposed system with alternative solutions in USD, to the nearest \$100. Where applicable, the cost of software is included.

Subsystem	This work	Lerner et al.6	Doric Lenses system
Optics	2100	6000	4600
Electronics	200		2100
Acquisition	1800	14,800	7500
Photodetector	2800	1400	2×1400
Total	6900	22,200	17,000

absorptivity, suggestive of blood flow volume effects (a macroscopic tissue heterogeneity).

The system was designed to offer a highly sensitive, yet costeffective alternative to existing commercial solutions. Table 1 provides a breakdown of the materials costs of proposed photometry systems in USD, showing close to a 60% improvement in cost-efficacy to the next most cost-effective system. A major cost of the alternatives is that of the data acquisition systems, and modulated light sources that inflate the cost of the optics in both alternatives. These analogous subsystems in the proposed system were built using off-the-shelf parts at a much lower cost, allowing for more of the experimentalist's budget to be devoted to the photodetector, improving overall system sensitivity. Full design and assembly documentation meanwhile enables rapid implementation by nonengineers, providing savings on indirect costs related to the time spent building and troubleshooting the system.

Design for cost-efficacy and low-light operation alone neglected a number of key features that have become standard for robust acquisition of photometry measurements. A coherent detection scheme enables immunity only to uncorrelated signals, be they stochastic (such as white noise or 1/f noise) or deterministic (for example, stray light). Movement artifacts and blood hemodynamics, in contrast, have a multiplicative effect on the detected baseband signal, and are therefore correlated with the desired signal. Correcting for these artifacts requires introducing reference signals to subtract their effect, such as the popular dual-excitation scheme for movement artifacts⁶ or dual-detection schemes proposed for imaging modalities.²⁷

Gross movement of the animal or bending of the fiber could be mitigated with a dual-excitation, isosbestic reference wavelength strategy proposed by Lerner et al.⁶ In this topology, a second LED at 405 nm excites endogenous fluorophores in tissue and is collected in the same emission band and detected by the PMT. A distinct modulation frequency for this excitation allows separation of the two signals by the detection electronics, and as 405 nm is an isosbestic point for GCaMP6s, the detected fluorescence intensity does not change with calcium saturation and is used as a reference signal to correct for movement artifacts. Due to the difference in tissue optical properties at the two wavelengths, particularly related to the absorption spectrum of hemoglobin, this strategy is limited to correction of artifacts of nonbiological origin.

On the other hand, photometric measurements may be obscured by dynamics in macroscopic tissue heterogeneities such as blood flow volume or refractive index due to the swelling of cells during action potential. This problem has been addressed for imaging modalities with a dual-detection scheme²⁷ to monitor fluorescence from coexpressed fluorophores, and could also be corrected by combining CICLoPS with wide-spectrum reflectance measurements and subsequent fitting of blood parameters.²¹

Finally, the responsivity of the CICLoPS configuration used for *in vivo* measurements in this work would likely be further improved by reconsidering the emission filter. The larger increases in fluorescence intensity detected by the commercial system in response to footshock is likely due to the use of a wider emission filter (525/50 nm) than employed in CICLoPS (515/30 nm) for these experiments. This filter was chosen to avoid a large peak at 543 nm typical of fluorescent room lighting systems, but also increases the sensitivity to autofluorescence from the optical fiber. Rather than using a filter that compromises sensitivity to the calcium reporter, thicker applications of dental cement with an added absorber could be used. Red food coloring was previously found to reduce transmission by 70%.²⁶

To our knowledge, the instrument described here achieves photometric measurements under the lowest level light conditions reported, achieving superior SNR with excitation light at 100 nW with a simple and cost-effective design achieved with a custom LIA on a PCB. This enables measurements to be taken without the nonlinearity induced by photobleaching, which simplifies subsequent data analysis and may enable the investigation of behavioral progressions that may take days or weeks to manifest. This work may help to extend fiber photometry to investigations that require long-term and repeated exposure of tissue to excitation light, such as those into learning and memory processes. The data collected from such studies would otherwise be inaccessible or difficult to interpret with the nonlinearities of photobleaching affecting day-to-day measurements. Cost-effective, low power photometry is needed to support techniques such as 24-h, in-cage monitoring that are increasing in popularity and require monitoring several animals simultaneously.

Disclosures

No conflicts of interest, financial or otherwise, are declared by the authors.

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