# Open-source, high performance miniature multiphoton microscopy systems for freely behaving animals

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<sup>16</sup> Here we describe the development of the UCLA 2P Miniscope, an easily adopted, open-source miniature

- 2-photon microscope capable of recording calcium dynamics from neurons located in deep structures and in
- $_{18}$  dendrites over a 445  $\mu$ m x 380  $\mu$ m field of view (FOV) during free behavior. The system weighs approximately
- <sup>19</sup> 4g and utilizes two on-board silicon-based photon detectors for highly sensitive measurements. All
- hardware is designed for high performance and ease of assembly, while minimizing cost. To test the 2P
  miniature microscope, we recorded in three experimental conditions to highlight its capabilities during free
- miniature microscope, we recorded in three experimental conditions to highlight its capabilities during free
  behavior in mice. First, we recorded calcium dynamics from place cells in hippocampal area CA1. Next,
- we resolved calcium transients from dendrites in retrosplenial cortex during 30 minutes of free behavior.

Last, we recorded dentate granule cell activity at a depth of over 620 μm, through an intact hippocampal

<sup>25</sup> CA1 during an open field behavior. The dentate granule cell recordings, to our knowledge, are the first

<sup>26</sup> optical recordings from these neurons ever performed in the intact hippocampus during free behavior. The

miniature microscope itself and all supporting equipment are open-source and all files needed for building
 the scope can be accessed through the UCLA Golshani Lab GitHub repository.

<sup>29</sup> Multiphoton | Miniature Microscope | Free Behavior

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# **Introduction**

Single-photon (1P) epifluorescent miniature microscopes are important tools that have generated numerous 32 neuroscientific advancements for more than a decade [1-8]. These microscopes enable researchers to image 33 neuronal activity from large populations of cells during naturalistic and free behaviors in mice and rats, without 34 the restraint of head fixation imposed by traditional benchtop microscopes. While miniature 1P microscopy holds 35 many positive attributes in dissemination, low cost, and ease of adoption, it has limited optical sectioning ability and 36 increased scattering of visible excitation light by neural tissue, compared to other modalities. In contrast, two-photon 37 (2P) microscopy, focuses near infrared (NIR) light to excite fluorescence within a single diffraction-limited volume, 38 which is scanned in time to form an image. This approach provides greater optical sectioning and can resolve fine 39 cellular structure even hundreds of micrometers into tissue [9-11]. Several groups have designed and developed 40 transformative miniaturized multiphoton microscopes to resolve dynamics from neural populations during free 41 behavior in rodents [12-21]. These microscopes utilize optical fibers to deliver ultrafast laser pulses to a miniature 42 headpiece, and a method of scanning the light across the brain. Scanning is accomplished either via an onboard 43 Micro-Electrical-Mechanical-System (MEMS) scanner mirror, through transmission over coherent optical fiber 44 bundles, or through movement of the distal tip of the excitatory optical fiber. In either case, 2P microscopes need 45 to spatiotemporally focus the excitation light with sufficiently high numerical aperture (NA) optical trains to generate 46 efficient 2P excitation without causing thermal disruption or damage to the tissue being studied. These microscopes 47 relay collected fluorescent signals to detectors positioned either on the headpiece itself or remotely via a single. 48 or a bundle of optical fibers. Despite this progress, open-source high performance 2P miniature microscopes that 49 are straightforward to assemble and use at a cost below \$10,000 USD do not yet exist. This work outlines such a 50 microscope. 51 52 Here, we describe the development of the UCLA 2P Miniscope, an open-source miniature 2P microscope 53

that weighs approximately 4g and is designed for ease of implementation by neuroscientists. We designed the 54 microscope around low-cost, simple-to-fabricate spherical optical components that are tolerant to misalignment. 55 Almost all optical elements, with the exception of the objective lens and tube lens are available off-the-shelf. 56 The mechanical components of the system were designed to be lightweight, while maintaining a high degree of 57 experimental durability. The housings are also designed with efficient assembly in mind, with highly accurate 58 internal stops, and arrowhead features to allow users to visually confirm correct lens placement and orientation. 59 Additionally, the housing components are all 3D printed, using easily attainable resin-based SLA printers. As such, 60 these components can be made in-house by labs at institutions with maker spaces, or inexpensively manufactured 61 by online 3D printing services. Mechanical parts can also be fabricated in large batches, increasing ease of adoption 62 by users. Two onboard silicon detectors enable rapid, high sensitivity fluorescence collection on the head of the 63 animal across two color channels; the high light collection efficiency of these detectors allows the user to acquire 64 high SNR images at large depths through scattering tissue. We also designed interface electronics to allow the user 65 to control the microscope in a straightforward way. Altogether, these easily assembled microscopes can record from 66 a 445µm x 380µm field of view (FOV) with high resolution even deep into brain tissue, for low cost compared to both 67

68 conventional and other miniature 2P microscope systems.



## Figure 1. UCLA 2P Miniscope optical system design and performance evaluation

(A) Full-system optical simulation and optimization in Zemax. All lenses, mirror surfaces and filters were simulated to ensure high optical performance once constructed and assembled. The detector path was simulated separately and superimposed here to demonstrate the full system as a combination of both optical paths. (B) RMS wavefront error over the 2mm MEMS scanner mechanical range was assessed using a linear Zemax model. System is diffraction limited for an input beam of 1.9mm over the FOV. (C) Measured axial focus range provided by the electro-tunable lens (D) Measured lateral and axial point-spread function (PSF). Lateral PSF is 980nm FWHM, axial is 10.18μm. (E) Example frame when imaging large, 4μm microspheres for calibration purposes.

# **Methods**

# 70 UCLA 2P Miniscope

# 71 Optical Hardware

We designed the UCLA 2P miniscope to be lightweight, with minimal tethering complexity, and to enable sustained 72 imaging of dynamics from deep structures during free behavior. The microscope's full optical simulation can be 73 seen in Figure 1A and optomechanical design and beam-path are shown in Figure 2A. Ultrafast laser pulses 74 are launched to a hollow-core photonic bandgap fiber (NKT HC-920) with a 3-axis fiber launch and a coupling 75 aspheric lens (ThorLabs, C230TMD-B). The light is delivered to the microscope headpiece via the thin flexible fiber, 76 at which point it is collimated with a molded aspheric lens (Newport Photonics, KGA170-B). An electro-tunable 77 lens (ETL) (Varioptic A-25H1) converges or diverges to the collimated beam according to a supplied electrical 78 signal, remotely controlling the depth of the focal plane (nominal WD =  $720\mu$ m) of the imaging system by  $\pm 75\mu$ m. 79 Following the tunable lens, the light is scanned on an integrated 2mm diameter 2-D MEMS scanner (Mirrorcle Tech, 80 A7M20.2-2000AL). A set of two 10mm focal length doublets are positioned near one another to form a scan lens set 81 (ThorLabs, AC050-010-B), with their exact positions defined by hard stops located within the microscope housing. 82 A dichroic beam-splitter (Chroma, ZT775sp-2p-UF1) directs the laser beam, which underfills a custom fabricated 83 6mm diameter doublet and 3-element objective assembly (Optics Technology, USA) thereby focusing the light into 84 the brain. The excitation path is designed to be diffraction-limited at the numerical aperture of approximately 0.36 85 over the 445µm x 380µm image field of view. Once 2P excitation is generated, fluorescent photons are collected 86 through the objective utilizing its full NA (~0.56), and relayed through the tube lens and dichroic mirror, to a collection 87 head fitted with on-board silicon detectors. The collected light is spectrally filtered to reject laser components using 88 two emission filters (Chroma, ET750sp) and directed with a 4.5mm focal length plano bi-convex collection lens 89 (Edmund, 47-895). Green and red components are split with another 1P dichroic mirror (Chroma, T550lpxr) and 90 corresponding signal is collected on fast, sensitive, and low-cost Hamamatsu MPPC detectors (S13360-3075PE) 91 located on the collection head. 92

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### Figure 2. UCLA 2P Miniscope mechanical hardware

(A) Optomechanical design of the system, including all housings, lenses, optical filters, and on-board PCBs in cross-section. The red beam denotes the 920nm excitation, and the green beam path describes the fluorescent collection onto the detector head.
 (B) Exploded view of the UCLA 2P Miniscope, describing the various sub-assemblies that work together, and the individual parts that comprise them. (C) Mechanical model of the microscope showing external appearance once assembled. (D) Assembled microscope under test at UCLA.

# 95 Mechanical System

To support and appropriately orient all of the optical components simulated in Figure 1, a custom-made mechanical 96 housing was designed in SolidWorks 2021 and fabricated using SLA-based resin 3D printers. The microscope's 97 optomechanical design can be seen in Figure 2 A-C and is composed of four sub-systems. First, a collimator 98 assembly, which supports the optical fiber ferrule and a collimation aspheric lens. The electrotunable lens is 99 positioned between the collimator and the main body of the microscope, secured in place via four thread-forming 100 torx screws. The screws also provide a clamping force between the electrodes of the UCLA 2P Miniscope flex-PCB 101 and the electrotunable lens, making for a reliable and secure electrical connection. The electronics subsystem, 102 described in detail below, is fixed to the main housing using UV adhesive (Norland 68). The main scope body 103 contains the scan lens set, the custom-made tube lens, and 2P dichroic mirror. The lower scope body assembly 104 secures the custom objective lens to the microscope, and interfaces with the baseplate on the head of the animal. 105 Lastly, the detector head press-fits into the main scope housing and can be secured with a small amount of UV 106 adhesive. 107

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# 109 Electronic System

Control of all microscope functionality is accomplished with several custom PCBs which relay control signals to one 110 another. Off the animal, there is a signal interface PCB, seen in Figure 3A, which combines inputs from an I<sup>2</sup>C 111 controller (NI, USB 8451 OEM), Hamamatsu SiPM drivers, an analog MEMS amplifier (Mirrorcle BDQ PicoAmp, 112 Analog), and other equipment into a single connector that can be easily accessed for experimentation. The miniature 113 microscope PCB itself, shown in Figure 3B, connects to the signal interface PCB over a thin and flexible set of 114 coaxial cables. This allows for control of the scanner position, as well as on-board driving of the electrotuneable 115 lens using the I<sup>2</sup>C data protocol. The circular, flexible electrodes on the PCB wrap around the electrotuneable lens 116 and deliver the appropriate signals from the ETL driver to the lens body. Altogether these PCBs work alongside 117 traditional electronics for controlling benchtop 2P microscopes, and enable straightforward and reliable driving of the 118 miniature 2P system. 119

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# UCLA 2P Miniscope Full Electronic System

### Figure 3. UCLA 2P Miniscope Electronic Circuitry

(A) Simplified block diagram of the custom and off-the-shelf electronic components. The custom PCBs communicate with one another via thin coaxial cables and the specifics of the connections can be seen. (B) UCLA 2P Miniscope interface PCB. This single low-cost 2 layer PCB integrates electronic signals from various sources and packages it into a single connector; the microscope plugs into this connector. This interface PCB receives four daughter boards: two SiPM drive modules (Hamamatsu), an I<sup>2</sup>C controller (NI), and the MEMS amplifier (Mirrorcle). The interface PCB receives inputs from ScanImage-compatible electronics and additional hardware. (C) UCLA 2P Miniscope flex PCB. These electronics are a fundamental part of the headpiece and are used to control the MEMS scanning mirror and electrotunable lens.

# 122 Custom Control Software

The miniature microscope hardware is mainly controlled by ScanImage (MBF Bioscience, free version) a commonly used software and user interface in the field of multiphoton microscopy. All machine configuration and user configuration files are available to users for direct implementation and ease of use. Running alongside ScanImage, a custom MATLAB script is used to control ETL position using the NI I<sup>2</sup>C controller (USB 8451 OEM) fitted on the signal interface PCB, and a free MATLAB hardware support package (National Instruments NI-845x I<sup>2</sup>C/SPI Interface).

Mechanical Component Fabrication Housings are entirely 3D printed using readily available SLA-based 130 machines (Formlabs Form 3) using standard, black V4 resin. STEP files of all mechanical parts, as well as 131 ready-to-print .form files with build resolution, orientation and support configuration will be uploaded to the UCLA 132 2P Miniscope GitHub repository following peer review, as a reference for users. After printing and standard curing 133 of the parts using 99% isopropyl alcohol (30 minutes) and UV light exposure (30 minutes at 60C), the internal bores 134 are lightly touched up using chuck reamers, either 1.8mm (collimator bore, MSC, 55451678), 5mm (scan lens bores 135 McMaster Carr, 8851A18) or 6mm (tube lens bore McMaster Carr, 8851A21). These tools are fitted to a t-handle 136 tap wrench and spun lightly by-hand into the bores of the collimator or microscope housing to remove any excessive 137 material left behind from the 3D printing process. Components are then airbrushed in 3-5 coats of matt-black acrylic 138 airbrush paint (50/50 blend with 99% isopropyl alcohol) to reduce light from the environment that can penetrate 139 through thin aspects of the microscope housings. Baseplates and cannular window implant rings are made from 140 sintered titanium and sourced from an online metal 3D printing house (Protolabs, Maple Plain, MN). 141

System Assembly Miniature microscopes were assembled following a straightforward set of steps. A precise building tutorial and step-by-step instructions will be made available on the UCLA 2P Miniscope GitHub repository after peer review, to assist others in building these microscopes. For a familiar user, a microscope headpiece will take approximately 30-45 minutes to assemble once all the housings are prepared and the assembled Flex-PCBs are sourced. Additionally, tutorials for launching the 2P laser onto an optical fiber, collimating the output of the optical fiber, and others will be provided, ensuring users are able to not only assemble the microscope headpiece, but the rest of the system as well.

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### 151 Animal Protocols

### <sup>152</sup> Surgical Preparation for Imaging

All experiments were conducted per National Institute of Health (NIH) guidelines and with the approval of the 153 Chancellor's Animal Research Committee of the University of California, Los Angeles. Imaging experiments used 154 to validate the performance of the UCLA 2P Miniscope were conducted on both male and female adult (>P60) 155 mice. Animals were anesthetized with isoflurane during the entire surgical procedure. Exposed fur on the skull was 156 trimmed away in a sterile manner, and animals were thermally maintained using a homoeothermic temperature 157 control blanket and controller from Harvard Apparatus. The animal was secured in a stereotaxic frame and 158 subcutaneously administered local anastatic (lidocaine at 1.5mg/kg and carprofen at 5.5mg/kg) 30 minutes before 159 the scalp was removed using a scalpel. The skull was scraped to facilitate effective bonding between the skull and 160 the implanted optical window. For CA1 and DG recordings, a 3.6mm circular craniotomy was made in the skull just 161 above PPC using a precision dental drill, taking care as to not damage the underlying dura. Cortical experiments 162 used a 4mm x 4mm square craniotomy. Following the removal of the section of skull, the site was flushed with cortex 163 buffer (NaCl = 7.88g/L, KCl = 0.372g/L, HEPES = 1.192g/L, CaCl2 = 0.264g/L, MgCl2 = 0.204g/L, at a pH of 7.4) 164 until all bleeding subsided. A viral injection of AAVs to express GCaMP6f, GCaMP7f or GCAMP8f was completed at 165 a rate of 1nL/sec into the targeted structure using a Nanoject injector (Drummond Scientific). For hippocampal CA1 166 recordings, a unilateral 1000nL injection of pGP-AAV-syn-jGCaMP7f-WPRE (Addgene: 104488) was performed. 167 Dentate gyrus recordings used 500nL of pGP-AAV-syn-jGCaMP8f-WPRE (Addgene: 162376) delivered unilaterally. 168 Animals used for RSC imaging received a mixture of AAV1.Syn.GCaMP6f.WPRE.SV40 virus (Addgene: 100837), 169 AAV1.cFos-tTA and AAV1.TRE.mCherry at 20 to 120 nL/min into dorsal cortex using stereotactic coordinates -1.7 170 and -2.3 mm posterior to bregma, 0.5mm lateral to midline, and -0.8mm ventral to the skull surface. For cortical 171 experiments, a thin #0 optical cover-glass (4mm x 4mm) was placed onto the surface of the brain and secured to 172 the skull using cyanoacrylate and dental cement. This results in an exposed area of approximately 3.5mm x 3.5mm 173 spanning the midline. When imaging sub-cortical structures like hippocampus or dentate gyrus, overlying cortex 174 was slowly aspirated, taking care to not damage the alveus. A custom-made titanium cannular plug (implanted 175 portion: 3.5mm diameter x 1.315mm depth; flange above skull: 5.7mm diameter x 0.285mm thick) was fitted with 176 a sterile 3mm #0 glass coverslip using optical adhesive (Norland 68) and secured using a UV-light gun. This plug 177 assembly is lowered into the craniotomy and secured to the skull with a thin layer of cyanoacrylate glue and dental 178

cement. Any residual tangential space between the surface of the skull and the flat base of the cannular plug was 179 filled using dental cement and allowed to harden completely. In all cases, the animals also have a stainless-steel 180 head-bar fixed to the skull that enables researchers to lower the microscope easily and find an optimal FOV for 181 recording. Following surgery, animals were given carprofen subcutaneously at 5.5mg/kg every 12-24 hours to 182 minimize pain and inflammation over the first 48 hours post-op. Animals were also provided amoxicillin-treated water 183 at 0.5 mg/mL concentration over 7-days and were allowed to rest for an additional 7-days to allow for full recovery 184 and to ensure the cover-glass had cleared. After 14 days, expression levels were assessed using a benchtop 2P 185 microscope (Scientifica VivoScope) fitted with a Nikon 16x/0.8NA water immersion objective. Once expression 186 levels and overall tissue health was confirmed, animals received a baseplate. First, the animal was head-fixed and 187 approximately 1mL of distilled water is added to the surface of the cranial window. Then, the UCLA 2P Miniscope 188 was lowered over the cover glass, with the baseplate already fitted to the lower microscope housing. The position of 189 the miniature microscope was controlled using a manual 3-axis stage and adjusted while imaging, until an optimal 190 FOV was found. Once the image field was identified, the baseplate was fixed using dental cement and allowed to 191 fully cure. The miniature microscope was then removed, and a small 3D printed window cover, the exact shape of 192 the lower microscope housing, is placed into the baseplate itself, to help mitigate the ingress of dust and debris onto 193 the recording area. This cover is very light (approximately 0.335g) and was fixed in place with two small screws in 194 the same way as the microscope itself. The animal was then removed from head fixation and returned to its home 195 cage. 196

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# **Object Exploration During Free Behavior**

<sup>199</sup> The microscope was attached to the baseplate and animals were allowed to explore a 28cm x 38cm chamber <sup>200</sup> containing a food pellet covered with peanut butter which they could consume. Behavior was recorded from <sup>201</sup> a high-resolution webcam (Logitech B910), and calcium signals were collected by the miniature multiphoton <sup>202</sup> microscope over time spans ranging from 10 - 60 minutes. Behavioral movies and calcium imaging movies were <sup>203</sup> synchronized by an in-frame LED which turns off on the precise onset of the microscope recording. Behavioral <sup>204</sup> frames are aligned to the first miniatene frame

<sup>204</sup> frames are aligned to the first miniscope frame.

# 205 **Results**

# 206 Optical Characterizations and Testing

# 207 FOV and ETL Range Measurements

The UCLA 2P Miniscope was first tested on several imaging specimens to assess resolution and performance prior 208 to use in animal experiments. First, fluorescent microspheres (Invitrogen, TetraSpeck Fluorescent Microspheres 209 Size Kit, T14792) of various diameters were imaged to tune parameters like drive waveform frequency amplitude, 210 bidirectional phase offset, and clock filter frequencies. The FOV was measured by displacing a 4µm bead (T14792, 211 position #1) from one edge of the image field to the opposite edge using an electronically controlled linear stage 212 with high precision and digital readout. Measurements were taken for each independent lateral axis. We then 213 assessed the axial range of the ETL with a piezoelectric actuator that was calibrated using a commercial z-stage 214 from a benchtop 2P microscope system. Digital commands were sent to the ETL, thereby offsetting the focal 215 plane in depth, and the piezo was adjusted manually to bring the focal plane back to the original view. Required 216 displacements of the piezo to restore focus were recorded for each ETL set point, resulting in a total displacement 217 of 150µm. 218

# 220 Lateral and Axial Point Spread Function (PSF) Measurements

Once the basic imaging parameters were assessed using 4µm microspheres, the optical resolution was 221 characterized with sub-diffractive 200nm fluorescent microspheres (T14792, position #4). First, the drive waveforms 222 were reduced in amplitude to effectively zoom the FOV to 50µm in each direction, as verified with the high-resolution 223 translation stage. Then, individual 200nm microspheres were brought into view with the ETL set to the digital value 224 500 (no appreciable focal power) and adjusted axially maximize bead diameter. 50-frame image sequences of 512 225 x 512 resolution were acquired, making the per-pixel sampling rate 97.5nm in the lateral dimension. Frames were 226 averaged together to reduce noise prior to taking line-profile measurements through the centroid of the bead. For 227 axial measurements, we used a calibrated, high-resolution piezoelectric actuator to displace the imaging slide by 228 ±20µm about the focal plane over approximately 40 seconds. The displacement of the slide and the onset of the 229 microscope recording were time-synchronized using external electronics (Digilent, Analog Discovery 3). In the axial 230 direction, 400 images were collected per stack, grouped mean projections of 10 images were calculated, resulting 231 in the final axial measurement stack of 40 frames with an axial displacement of 1µm between frames. A circular ROI 232 is drawn which encircles the bead and the mean value of the pixels within the ROI are computed for each image 233 in the stack. The Z-axis profile was used to assess the changes in mean value across the 40µm displacement, 234 and thus, axial resolution. The final measurement included > 10 beads for each direction (lateral and axial) which 235 were then shifted relative to each other as to align their maximum values, accounting for any misalignments in 236 experimental setup. These measurements were then averaged over all beads, and a gaussian function was fit for 237 each direction (Figure 1D). The full-width-at-half-maximum of the gaussian fits were used to describe the resolution 238 of the microscope, which was found to be 980nm in the lateral dimension, and 10.18µm axially. These numbers are 239 in close agreement with our optical simulations and suggest an effective excitation NA of ~0.36 [22] which matches 240 the predicted NA of 0.36. 241

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Testing in Physiological Conditions Following PSF measurements, ex-vivo tissue slices expressing GCaMP6f 243 were visualized, in order to assess detection sensitivity as a function of excitation laser power. Slides were imaged 244 under ~30 mW of laser power, clear cell bodies and processes were observed, confirming that the microscope 245 can generate sufficient signal from physiological concentrations of fluorescent molecules of interest. Following 246 tissue slice recording, we tested the imaging ability of the microscope in-vivo, with head-fixed animals expressing 247 various GCaMP varieties, including 6f, 7f, and 8f. Animals were implanted with a cranial window over cortex or a 248 canular implant above hippocampus (described in detail in the Methods). Neural activity was captured in multiple 249 experimental conditions (Figures 4, 5, 6) verifying the microscope's capacity to resolve neural dynamics in vivo. 250

# 251 Free Behavior Experiments In-Vivo

# 252 Resolving Place Cell Activity in Dense Neuronal Populations in CA1

The optical sectioning ability of 2P microscopy allows imaging of activity from dense neuronal populations) with high 253 spatial resolution. To understand how the 2P miniature microscope performed at imaging dense populations, we 254 recorded neurons expressing GCaMP7f in the pyramidal layer of CA1. We recorded from populations of neurons 255 expressing Ca<sup>2+</sup> indicators while the mouse freely navigated an approximately 38cm x 28cm chamber over periods 256 ranging from 24-60 minutes. The position and locomotion of the mouse was recorded by a behavioral camera 257 positioned roughly 50cm above the chamber recording at 30 frames per second (FPS). Positional information was 258 extracted using DeepLabCut [23]. Image data from the miniature microscope was processed using Suite2P [24] to 259 perform non-rigid motion correction, segment individual neurons, and extract calcium traces. On average from 6 260



### Figure 4. Example CA1 recording session

(A) Schematic drawing of the imaging conditions, including the titanium cranial window implant and the objective lens from the UCLA 2P Miniscope. (B) 1P image collected in the same animal, in the same brain region on the same day as all other panels except E. 1P Image was collected with a custom-made benchtop 1P microscope with a 0.5NA and high resolution scientific Complementary Metal Oxide Semiconductor (sCMOS) image sensor. (C) Experimental mouse in the behavioral chamber, during the > 20-minute imaging session. Light-blue line shows a subset of the animal trajectory in the chamber over time. (D) Imaging results from the microscope system over the course of the free behavior experiment. (E) Extracted footprints of the active neurons within the FOV (randomly-colored) following motion correction, overlayed on the maximum intensity projection image. (F) Neuropil subtracted activity from the neurons in G and H. (G) Firing locations of a subset of neurons from F and H plotted within the behavioral arena. (H) 25 example statistically significant place cells.

free-behavior recording sessions, we resolved dynamics from 110 ±8 active neurons in CA1 within the field of view. 261 following processing with Suite2P. The exact parameters for the analysis are included with the rest of the control 262 software, in the form of an ops file that can be easily referenced or deployed by users. Figure 4 demonstrates an 263 example CA1 recording session where an approximately 20g female mouse can be seen navigating throughout 264 the chamber while neural activity is recorded. Over the 20-minute session, the median speed of the mouse was 265 ~4.1cm/s which is similar to previous results regarding the impact of microscope weight on median animal speed 266 [17] when considering the system weighs ~4g. Within one recording session, we observed more than 32 cells with 267 spatial firing preference (highlighted in E, F, G, H of Figure 4), suggesting that the UCLA 2P Miniscope is able to 268 resolve the activity of place cells in CA1 over behaviorally relevant timeframes. 269 270



### Figure 5. Dendritic imaging in cortex during free behavior

(A) Schematic drawing of the experimental preparation used to record from RSC and the curvature of the cortical column that makes resolving long dendrites in the cortex possible. (B) Time-course of still frames over the course of the 30-minute recording, highlighting the axial stability of the system and ability to reliably track single projections over substantial timeframes.
 (C) Pseudo-colored image exported from Suite2P which colors ROIs by their aspect ratio. This is superimposed on the mean of the entire recording. (D) Calcium signals from somatic (blue) and dendritic ROIs (red) plotted separately. (E) Animal trajectory over the 30-minute experiment.

### 271 2-Color Recordings of Dendritic Calcium Dynamics and a Static Reporter in RSC during Free Behavior

1P miniature microscope systems are largely constrained to studying activity patterns from relatively superficial 272 somas near the implanted window or GRIN lens largely due to scattering and fluorescent background in neural 273 tissue. Multiphoton systems, on the other hand, are able to resolve calcium events in fine cellular structures such 274 as dendrites and axons, hundreds of microns below the surface of the brain. One major goal in the development 275 of our miniature 2P microscope was to build an imaging system with sufficient resolution and sensitivity to study 276 dendritic patterns of activity, since the mechanisms by which neural inputs are integrated during free behavior 277 is largely understudied in the field. To assess the system's ability to detect activity from dendrites, we recorded 278 AAV-GCaMP6f in layer 2/3 neurons in retrosplenial cortex (RSC) during free behavior on the first color channel, 279 along with cFos-expressed mCherry on the second detector channel. Because RSC is such a medial structure, 280 cortical layers are rotationally oriented such that the apical dendrites of pyramidal cells are within the same imaging 28 plane as the cell bodies. We leveraged this anatomical feature to our advantage to study dynamics not only from 282 somas, but their corresponding apical dendrites as well, during free behavior. To gain optical access to RSC, a 4mm 283 x 4mm cortical window was placed over the region (details in Methods). While this window was larger than optically 284 required, it provided experimental flexibility and the ability to locate an FOV where dendrites and somas are both 285 coplanar and clearly visible. Figure 5 shows the results of an RSC experiment, including the image data, mouse 286 position, and activity traces from both cell bodies and dendrites. The high degree of correlation between the activity 287 of the RSC somas and proximal regions of apical trunk dendrites suggests that the majority of the events resolved 288 are global calcium events activating both soma and dendrites in the FOV. Over 30-minute recording sessions, 289 individual dendrites remained stable within the image field (especially in the z dimension) with no need to remove 290 any portions of the recording where dendrites were lost due to motion. Therefore, the UCLA 2P miniscope is ideal 291 for studying dendritic and potentially axonal dynamics during free behavior in mice. 292

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# <sup>296</sup> Imaging Granule Cell Activity in Dentate Gyrus During Free Behavior

The dentate gyrus (DG) is a critical region within the hippocampal formation and tri-synaptic circuit with extensive 291 and direct connections to other hippocampal subfields and the entorhinal cortex. The principal cells of the DG, 298 dentate granule cells, have been implicated in spatial navigation, episodic memory formation, and discrimination 299 learning [25]. The DG is also a key site for adult neurogenesis in the mammalian brain, including humans [26–29]. 300 Studying dentate granule cell activity in vivo through electrophysiological methods has proven challenging due to 30 their extremely sparse but highly salient activity [30], which complicates accurate spike sorting in these neurons. 302 More recently, groups have turned to calcium imaging, which directly visualizes spiking neurons, in order to study the 303 dynamics of granule cells during spatial navigation. However, the current use of calcium imaging in the DG still has 304 significant limitations. In the dorsal hippocampus of the rodent brain, the DG sits deep to CA1 and other subfields 305 within the tri-synaptic circuit. Ideally one would like to maintain the integrity of all the hippocampal subfields and 306 their connections when measuring activity in the DG. The depth of the dentate granule cell layer lies (~500-650µm) 307 below the surface of the hippocampus (alveus), precluding the use of single photon methods to image the DG within 308 the intact hippocampus. Researchers have relied on the use of GRIN lenses and aspiration and disruption of the 309 overlying CA1 to gain optical access to the DG and resolve dentate granule cells using 1P miniature microscopes 310 [31]. Capitalizing on the ability of multiphoton microscopy to image several hundred micrometers into tissue, others 311 have conducted multiphoton imaging studies in head-fixed animals using surgical approaches that maintain the 312 structure of the full hippocampus. However, these studies rely on virtual or floating environments to study spatial 313 navigation [32], which lack vestibular and other important inputs that can modulate place cell activity [33]. To 314 address these limitations, we tested the ability of the miniature 2P microscope to resolve granule cell activity in 315 freely behaving mice exploring a novel environment. Sparse dynamics were captured from ~50 granule cells over 316 the approximately 20-minute recording interval. Figure 4 displays the imaging results from an example imaging 317 session, as well as extracted neuronal footprints and activity traces. Taken together, these results demonstrate the 318 capacity of the UCLA 2P Miniscope to resolve calcium transients even from deep neuronal populations during free 319 behavior. 320



# Figure 6. Recording calcium dynamics in deep structures with the UCLA 2P Miniscope

(A) Schematic drawing describing the placement of the titanium cannula and cover-glass assembly relative to the image field in DG. Cells in CA1 were also expressing GCaMP8f and are thus also labeled as green. (B) Montage of frames from a continuous z-stack in a head-fixed mouse expressing GCaMP8f. The microscope was able to continuously image from CA1 to the granule cell layer of DG. This was done before the free behavior experiment shown in the following panels. (C) FOV from DG, through an intact hippocampus during a 20-minute free behavior experiment. Colored cells were identified as active using Suite2P. (D) Activity traces from a subset of the identified active neurons shown in C. (E) A single example neuron activity trace with a high number of events compared to the average. Calcium peaks identified from the deconvolved signal are plotted as red dots above the neuropil-subtracted activity. (F) Animal trajectory over the 20 minute experiment. (G) Statistically significant spatial activity plots for a subset of the cells displayed in C.

Component	Manufacturer, Part Number	Quantity	Cost	Subtotal
Objective Lens	OT, Custom - 1	1	\$4000.00	\$4000.00
Tube Lens	OT, Custom - 2	1	\$1100.00	\$1100.00
Scan Lens	ThorLabs, AC050-010-B	2	\$51.38	\$102.76
Aspheric Lens	Newport, KGA170-B	1	\$104.00	\$104.00
Collection Lens	Edmund, 47-895	1	\$62.50	\$62.50
2P Dichroic	Chroma, ZT775sp-2p	1	\$540.00	\$540.00
1P Dichroic	Chroma, T550lpxr	1	\$112.50	\$112.50
2P Emission Filter	Chroma, ET750sp	2	\$150	\$300
MEMS Scanner	Mirrorcle, A7M20.2-2000AL	1	\$591.00	\$591.00
Electrotunable Lens	Varioptic, A-25H1	1	\$135.00	\$135.00
Mechanical Housings	Custom Made	4	\$10	\$40
PCBs	PCBWay, Custom Made	1	\$50	\$50
SiPM Detectors	Hamamatsu, S13360-3075PE	2	\$52.88	\$105.76
				\$72/13 52

**Table 1.** Cost breakdown for the UCLA 2P Miniscope microscope headpiece. These costs are as of March 2024 when components were purchased at small scale. Please note that these expenses do not include key additional hardware, such as laser and traditional 2P microscope acquisition electronics.

# 321 Discussion

# 322 A Cost Effective 2P Miniature Microscope

We developed the UCLA 2P Miniscope to be cost effective without significantly compromising performance. Our entire microscope headpiece can be built for less than \$7.5k USD currently with low production numbers and likely with scaling can be reduced to approximately \$5k USD each. The majority of the cost comes in the form of the custom optical assemblies which are assembled, coated, and tested individually by Optics Technology in New York, USA. With scale, we predict these assemblies to drop in cost and further lower barriers of entry to labs hoping to use miniature 2P microscopes to study neural dynamics in freely behaving animals. To our understanding, this is the first miniature 2P microscope that is open sourced and able to be built for less than \$10k USD.

# 331 Shareable Design Philosophy

We developed the UCLA 2P miniscope as an open-source, easy to assemble miniature multiphoton microscope with 332 high resolution and frame rates optimized for calcium imaging experiments. From the start of the project, lowering 333 cost and maximizing ease of user dissemination has been a critical focus, and we have carried these priorities 334 into each aspect of the microscope design. Custom-made lens assemblies are limited to a modest number of lens 335 elements, for a high degree of mechanical tolerance during assembly and general affordability. The majority of 336 components are off-the-shelf components and easy to procure, in order to lower barriers of entry to labs interested 337 in using this technology. The housings are made using low-cost resin-based 3D printers (all files are uploaded 338 to the Git repository) and can be made easily in large batches. We integrated silicon-based detectors onto the 339 collection head of the microscope similar to 3-photon miniature systems in the literature for rats and mice [20, 21] 340 to remove cumbersome and photonically lossy fiber bundles. In addition, we designed electronic interfaces to be 341 plug-and-play and easy to interface with. Initial, fully functional versions of these electronics are uploaded to an 342 open Git repository, and newer, even easier-to-implement versions are nearly complete for user implementation, 343 complete with a standalone python-based GUI. Those designs will be uploaded soon, following peer review. The 344 result is a ~4g miniature 2P microscope system with sub-micron lateral resolution over large image fields, useful for 345 studying neural dynamics of deep structures or fine features in freely behaving animals. 346 347

# 348 Ease of Assembly

Our goal is to make miniature 2P microscopy as accessible to as many users as possible, while pushing the technical limits of what such systems are capable of achieving. Intentional design tradeoffs were made throughout the engineering process which ultimately prioritized user adoption over absolute performance. One example of this is the tunable lens. Other microscope systems use stacks of piezoelectric tunable interfaces to generate sufficient optical power to translate the focal plane by respectable amounts. [17] While these elements are

extremely lightweight (0.06g) and seem to perform very well, they are difficult to align together into a colinear, 354 stacked assembly and install into the microscope body, resulting in a barrier to entry for users. In contrast, we 355 use off-the-shelf Varioptic lenses which are substantially heavier (0.36g) yet are easy to source and install. This 356 intentional decision was made not due to performance, but to achieve increased user friendliness and adoption 357 capability. We believe that these benefits outweigh the cost associated with the modest increase in weight of the 358 UCLA 2P Miniscope compared to other similar systems. 359

360

#### **Collection Efficiency** 361

The UCLA 2P miniscope also uses on-board Si-based detectors, similar to those used in 3P applications [20, 21]. 362 Such a detection scheme substantially improves collection efficiency of the microscope and thus makes resolving 363 dynamics from deep structures like DG possible, at the expense of added weight. The microscope in its current 364 form uses two detectors, to record from red and green channels, as well as collection optics and spectral filters to 365 isolate colors onto discrete detectors. Because of this, the microscope incurs some additional weight, at the benefit 366 of being able to record deep and challenging brain areas in two colors. 367

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#### **Experimental Robustness** 369

Lastly, the optical design is rather simple, and the mechanical housings are intentionally robust. We know from 370 experience that imaging devices used in freely behaving animal experiments are subject to great abuse, during 371 which housings can break, or optical misalignments may occur. By simplifying the number of components and 372 interfaces, we not only made the optical tolerances forgiving, but we also made the device reliable. Despite 373 this simplicity, the microscope is able to resolve sub-micron features in neural tissue. In key portions of the 374 mechanical housings, the wall thickness is deliberately thick, resulting in components resilient to knocks, bumps, 375 and drops. This increases weight, but ultimately improves useability by researchers and ensures the device works 376 in realistic environmental conditions, which is of paramount importance. Altogether, the UCLA 2P miniscope is a 377 high-performance microscope intended to be set up and used by other labs. Decisions were made throughout the 378 design process which included known sub-optimizations, which in turn impose limitations on performance. In each 379 circumstance, these tradeoffs were made to the benefit of user adoption and reducing the barriers to entry as much 380 as possible. We believe most labs with 2P microscopy experience will be able to set up the UCLA 2P miniscope 38 hardware for approximately \$5k USD when produced at reasonable scale. 382 383

# **Analysis Methods**

# 385 Measuring place firing preference in CA1 and DG

Microscope images were processed using Suite2P [24] version 9.2 to correct for motion artifacts, perform 386 segmentation, and calculate activity traces over time. Suite2P deconvolved the slower calcium dynamics according to 387 the specific GCaMP being used in a particular experiment, generating a spks matrix used for downstream analysis. 388 Animal locations were calculated from a time-synchronized behavioral video using a trained neural network via 389 DeepLabCut [23]. To evaluate the spatial firing properties of neurons, a MATLAB script was written which follows 390 methods previously published [7]. Position information was down sampled to the same number of time points as 391 there are behavioral frames throughout the experiment. Space within the frames was discretized into 2.08cm x 392 2.08cm spatial bins for CA1 and DG recordings. A speed threshold of 2cm/s was applied to restrict consideration 393 of data while the animal was immobile. An occupancy matrix was constructed by summing the number of samples 394 spent in each spatial bin, and a spatial neural activity matrix was calculated as the sum of all deconvolved activity 395 for each spatial bin. Each of these matrices were smoothed using a 2D gaussian kernel with a sigma of 6cm. After 396 filtering, the smoothed spatial neural activity matrix was divided by the smoothed occupancy matrix to arrive at a 397 spatial neural activity rate for each neuron. Shannon Information, (1), was calculated for each neuron using the 398 Kullback-Leibler Divergence formula, as implemented in [34]. 399

$$I = \sum_{i} \left( \frac{\lambda_i}{\overline{\lambda}} \log_2 \left( \frac{\lambda_i}{\overline{\lambda}} \right) p_x \right)$$

Such that  $\lambda_i$  is equal to the rate of neuronal activity at bin (*i*) and  $\overline{\lambda}$  is the mean neural activity rate [7]. Statistical significance was assessed using circular shifting. Neural activity traces were offset by a random number of samples in time, ranging from one sample to the total number of samples within the recording such that the end of the neural activity vector is circularly wrapped to the beginning. This effectively shuffles the relationship between the animal's position and the extracted neural activity. Information content was calculated for all 500 shuffles, across each identified ROI. Only the ROIs whose information content was significantly greater than chance ( P > 0.95 ) were considered place cells and plotted in Figures 4 and 6.

# **407** Future Directions

The majority of the effort in this project went to the design and development of the head-mounted microscope 408 hardware. While this is an extremely critical aspect to the overall system, there are other key components which are 409 critical for function and user adoption. Firstly, free-space propagating 2P laser sources are expensive and present 410 a financial as well as technical barrier to many labs. Launching these lasers with multi-axis fiber launches can 411 be complex for users without optical alignment experience. The advent of lower-cost, fixed frequency fiber lasers 412 with direct fiber coupling, and large amounts of GVD compensation has helped bring the challenges down to user 413 adoption. In the future, we hope to work with laser manufacturers to offer solutions which are easily implemented at 414 an affordable price. Secondly, we are currently working on building standalone low-cost electronic drivers to control 415 microscope hardware via an intuitive and open-source python-based GUI. We believe that users should just be able 416 to plug in the microscope over a thin, flexible bundle, start a simple program alongside a control suite like ScanImage, 417 and be able to record quickly and easily in freely behaving animals. The next generation PCBs and control software 418 will be made available as soon as it is completed. Lastly, we aim to make these devices at scale, such that unit 419 costs can come down to approximately \$5k USD per microscope. This final cost is well within the reach of user 420 accessibility and will ensure that the miniature microscopes can be used by as many labs as possible. 421

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