

Research Article: Methods/New Tools | Novel Tools and Methods

## Pi USB Cam: A simple and affordable DIY solution that enables high-quality, highthroughput video capture for behavioral neuroscience research

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#### 49 ABSTRACT

50 Video recording is essential for behavioral neuroscience research, but the majority of available systems suffer from poor cost-to-functionality ratio. Commercial options frequently come at high 51 52 financial cost that prohibits scalability and throughput, whereas DIY solutions often require 53 significant expertise and time investment unaffordable to many researchers. To address this, we 54 combined a low-cost Raspberry Pi microcomputer, DIY electronics peripheries, freely available 55 open-source firmware, and custom 3D printed casings to create Pi USB Cam, a simple yet 56 powerful and highly versatile video recording solution. Pi USB Cam is constructed using 57 affordable and widely available components and requires no expertise to build and implement. 58 The result is a system that functions as a plug-and-play USB camera that can be easily installed 59 in various animal testing and housing sites and is readily compatible with popular behavioral 60 and neural recording software. Here, we provide a comprehensive parts list and step-by-step 61 instructions for users to build and implement their own Pi USB Cam system. In a series of 62 benchmark comparisons, Pi USB Cam was able to capture ultra-wide fields of view of behaving 63 rats given limited object distance and produced high image quality while maintaining consistent 64 frame rates even under low- and no-light conditions relative to a standard, commercially 65 available USB camera. Video recordings were easily scaled using free, open-source software. 66 Altogether, Pi USB Cam presents an elegant yet simple solution for behavioral neuroscientists 67 seeking an affordable and highly flexible system to enable quality video recordings.

#### 68 SIGNIFICANCE STATEMENT

69 Video capture is increasingly necessary for neuroscience research where neural and behavioral 70 data are synchronized to reveal correlative and causal relationships. This relies on a recording 71 system that can capture quality videos without significant alterations to pre-existing 72 experimental conditions (e.g., lighting, space, etc.), enables easy online and offline analysis by 73 commonly used software, and offers high scalability to increase throughput. However, the high 74 cost and poor flexibility of commercially available options leave the role of an ideal video 75 recording system unfulfilled. Here, we present a DIY video recording solution that combines 76 affordable electronics hardware and custom 3D printed components with sophisticated open-77 source software to make a simple, yet powerful USB camera that satisfies almost any recording 78 need.

#### 79 INTRODUCTION

80 Video recorded data is a crucial component of behavioral neuroscience research. While 81 a number of commercially available recording solutions exist, few, if any, satisfy all or most of the needs of a typical laboratory. Many behavioral assays, particularly those intended for use 82 83 with nocturnal species, are conducted under low- or no-light conditions to mimic the portion of 84 the circadian cycle during which animals are the most active. Therefore, an ideal video 85 recording system enables video acquisition under both ambient and infrared (IR) illumination. 86 Moreover, spatial limitations imposed by testing apparatuses frequently require capture of a 87 large field of view from a relatively short object distance. Although some commercially available 88 options designed specifically for behavioral neuroscience research meet these criteria, they are 89 often expensive and unique to a specific testing apparatus limiting scalability and flexibility of 90 use. Given these limitations, researchers frequently repurpose commercial USB webcams for 91 video acquisition because of their affordability and accessibility. However, webcams are rarely 92 intended for recording under low- to no-light conditions, nor for capturing a large field of view 93 under circumstances when subjects are at a relatively short distance from the camera.

94 DIY solutions that make use of low-cost, single board microcomputers such as 95 Raspberry Pi have gained the attention of behavioral neuroscientists as laboratories attempt to 96 address the shortcomings of existing commercially available solutions. For example, Singh et al. 97 (2019) developed a powerful web-based interface for long duration, remote video recording and 98 streaming. However, lack of active maintenance and development quickly rendered it obsolete 99 as the current generation of Raspberry Pi board (4B) no longer supports the legacy OS 100 (Raspbian Stretch) for which it was developed. Recently developed solutions that use the 101 Raspberry Pi Camera in its most basic form to acquire video are less demanding in terms of 102 debugging and updating (Saxena et al., 2018; Weber and Fisher, 2019; Clemensson et al., 103 2020; Centanni and Smith, 2021). However, these out-of-the-box options suffer from limited 104 functionality, often lacking the capacity to live preview and record at the same time, or interface

with closed-loop behavioral control systems. As a result, DIY solutions frequently require a degree of programming knowledge to properly configure and adapt the system to specific research needs thereby limiting broad application of such systems by novice users. Thus, drawbacks associated with both commercially available and DIY video capture solutions pose significant limitations to easy acquisition of video recorded behavioral data.

110 To address this gap, we designed a versatile, low-cost, DIY video recording solution that 111 requires no specialized expertise or equipment. The Pi USB Cam is low-/no-light compatible 112 and accepts a variety of wide-angle lenses. The system utilizes open-source, actively 113 maintained software that enables true plug-and-play capability. Combined with custom 3D-114 printed components and freely available open-source video acquisition software, this system 115 offers highly versatile implementation and scalability across numerous behavioral testing 116 conditions. Here, we provide detailed step-by-step instructions for hardware and software setup 117 and demonstrate its ease of use and superiority in terms of field of view and low-light recording 118 over commercial counterparts.

#### 119 MATERIALS AND METHODS

#### 120 Build the camera

121 Pi USB Cam is comprised of a Raspberry Pi board (Raspberry Pi, Cambridge, 122 Cambridge, UK) and a wide-angle day-night vision camera (Arducam Technology Co., Limited, 123 Hong Kong, China). This camera comes equipped with a motorized IR-CUT filter that is 124 automatically triggered based on ambient light intensity to accommodate for both bright-light 125 and low-/no-light recording, as well as an out-of-the-box 170° [Diagonal FOV] x 140° [Horizontal 126 FOV] fisheye lens. The camera uses a 5MP OV5647 sensor, which can support up to 30 frames 127 per second (FPS) at 1080p when used with the suggested firmware. Additionally, the camera 128 comes attached with two 850 nm infrared LEDs to facilitate image acquisition in low-/no-light 129 conditions.

130 We selected the Raspberry Pi 4 Model B to run the camera, which was the latest release 131 of the main product line at the time of publication. This model and the more affordable and 132 compact Raspberry Pi Zero are readily supported by Show-me webcam, an open-source 133 firmware that enables a Raspberry Pi connected camera to be booted as a simple USB camera. 134 While both models are compatible as the base hardware for building a Pi USB Cam, we chose 135 Pi 4B over Zero due to its added processing power, which is significantly more advantageous if 136 the Pi board were to be repurposed for GUI applications. Of note, while the Raspberry Pi Zero 2 137 was recently released, it is not yet supported by Show-me webcam, although this is likely to 138 change in near future. Legacy boards like Pi 3+ and earlier releases that are no longer widely 139 accessible for purchase are not supported by Show-me webcam.

140 A complete list of store-bought components is provided in **Table 1** with a more 141 comprehensive list including alternative options provided in **Extended Table 1-1**.

142

#### 143 Step-by-step instructions

144 Software installation

Insert a clean micro-SD card with a minimum storage of 64MB into your computer (Figure
 146 1A).

Download the latest release of the *Show-me webcam* image file to your computer from the developer's GitHub page <u>https://github.com/showmewebcam/showmewebcam</u> (Figure 1B).
 Make note to download the image file corresponding to the appropriate Raspberry Pi board model.

151 Pi 3. Download, install, and launch the official Raspberry Imager from 152 https://www.raspberrypi.com/software/ (Figure 1C). Inside the imager's main interface, click 153 on CHOOSE OS followed by Use custom to locate the image file you just downloaded (Figures 1C1-2). Then, click on CHOOSE STORAGE and select the clean micro-SD card 154 155 (Figures 1C3-4). Lastly, click on WRITE followed by YES on the pop-up warning to flash 156 the Show-me webcam image file into the micro-SD card (Figures 1C5-6).

157

#### 158 Hardware Assembly

Gather the essential hardware components shown in Figure 2A and appropriate housings if
 desired for the Pi board (Table 1) and camera (Table 2).

OPTIONAL: If you intend to use the camera for low-/no-light recording close to a reflective surface such as plexiglass, we recommend removing the IR LEDs that come attached to the camera module (**Figure 2B**) at this stage. Doing so will allow for flexible LED placement thereby enabling the user to avoid flaring artifacts in the captured image (**Figure 4A**). For more information on how to use and position LEDs independently from the camera refer to "IR LED Setup" and see Figure 4.

To connect the camera module to the Pi board, first locate the camera ribbon cable ports on
 the camera module and the Pi board, as indicated in Figure 2C1. Gently lift the black
 plastic clip on the ports. Insert the ribbon cable terminal making sure that the silver leads on

172 3. Insert the micro-SD card prepared in *Software Installation* into the micro-SD card slot on the
173 back of the Pi board to finish the setup (Figure 2D).

To power up and start using the Pi USB Cam, connect it to a host computer via its USB-C
 port using a USB cable (Figure 2E1). The red built-in LED should stay lit to indicate that it
 is receiving adequate power supply (Figure 2E2). The green built-in LED will fast blink
 three times after booting, which will take around 5 seconds, to indicate that the Pi USB Cam
 is ready for use. This LED will remain illuminated when the Pi USB Cam is in active use
 (Figure 2E2).

5. You can optionally house the Pi USB Cam in our custom 3D-printed camera case for
 protection and use mount tools for easy installation in a variety of behavioral testing
 configurations (Figures 2F, 9-11). STL files and print instructions can be found at our
 Thingiverse page: <a href="https://www.thingiverse.com/gloverlab/designs">https://www.thingiverse.com/gloverlab/designs</a>.

NOTE: The STL files provided can be readily sliced by popular slicing software and printed
with consumer-grade 3D printers or commercial pay-to-print service offered by universities
and elsewhere. For an estimated cost of printing a full set of our camera and IR LED
holders using either printing options, see Extended Table 1-2.

188

#### 189 Adjusting camera settings

The Arducam day-night vision camera module that we suggest using here has an onboard photoresistor (**Figure 3A1**) that senses ambient light intensity. This allows for automatic control of the IR filter to enable IR sensitivity under low-/no-light conditions (**Figure 3B**) and improve color accuracy under bright light conditions (**Figure 3C**). However, in scenarios where lighting conditions change dramatically within a single recording or approach the ambient light threshold, one might consider manually disabling the motorized IR filter to prevent automatic IR filter shuttering and keep it in either a permanent ON or OFF state throughout the entire recording session. Covering the photoresistor with non-translucent tape will prevent ambient light from reaching the sensor thereby enabling IR sensitivity by permanently turning the IR filter OFF (**Figure 3A1**). Conversely, to manually enable IR correction, the IR filter can permanently be switched ON by unplugging the motorized IR filter connector from the back of the camera board (**Figure 3A2**).

202 Camera software settings such as brightness and white balance can also be readily 203 adjusted to suit specific recording needs, such as improving the image color when recording 204 under low-light conditions (Figure 3B). Users can access camera setting parameters by 205 interfacing the Pi USB Cam with a host computer. The following protocol (adapted from 206 https://tutorial.cytron.io/2020/12/29/raspberry-pi-zero-usb-webcam/) describes how to access 207 and adjust camera setting parameters on a Windows PC using an open-source software called 208 PuTTY (Figure 3G), which allows the PC to establish a serial connection with Pi USB Cam. The 209 same can be accomplished on a Linux or Mac computer via command line (visit the official 210 debugging guide for more: https://github.com/showmewebcam/showmewebcam).

211

#### 212 Step-by-step instructions

- To identify which USB serial communication (COM) port on your host PC the Pi USB
   Cam is using, open **Device Manager** and locate the COM port number of the camera
   under **Port (COM & LPT) (Figure 3E)**.
- 216 NOTE: If you have more than one USB serial device connected to your computer, you
   217 can disconnect and then reconnect Pi USB Cam while monitoring hardware changes in
   218 Device Manager to confirm which COM port is used by which camera.
- Download, install, and launch PuTTY from <u>https://www.putty.org</u>. To establish a serial
   connection with the Pi USB Cam, first make sure that **Session** is selected under
   **Category (Figure 3F1)**. Then set **Connection type** to **Serial (Figure 3F2)**, enter the

222 COM port number of the camera under Serial line (Figure 3F3), and set Speed to
 223 112800 (Figure 3F4). Click Open to log into the Pi USB Cam (Figure 3F5).

Once logged in, type the following command /usr/bin/camera-ctl and press Enter
 to launch the camera-ctl interface and show all adjustable camera setting parameters
 (Figure 3G). These can be adjusted during live preview to see how any changes affect
 image quality.

228 OPTIONAL: We recommend setting Video Bitrate to Maximum (25000000), and Auto 229 Exposure, White Balance, and ISO Sensitivity Auto to Manual (Figure 3G2), to 230 improve the image coloring under low-light conditions (Figure 3B). We also set 231 Brightness to 53 for all low-light recordings used in this paper. For recording under 232 bright-light conditions, consider reverting White Balance to the default Auto to improve 233 color accuracy (Figure 3C). However, we encourage experimenting with the setting as it 234 likely varies with the recording condition and recording devices.

4. Once finished, press S to save the changes in the camera setting parameters, or revert
back to default by pressing D (resets individual setting to default) or R (resets all settings
to default). To terminate the serial connection, first press Q to quit the camera-ctl
interface, and then close the PuTTY session window.

5. To adjust the focus on the camera lens, first loosen the screw that secures the lens
firmly inside the M12 lens holder, as indicated in Figure 3H, then simply turn the lens
clockwise or counterclockwise while monitoring the camera preview until the image
becomes sharp.

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#### 244 IR LED setup

IR-sensitive cameras need to be coupled with adequate IR illumination to produce high quality images in low-/no-light conditions. The wide-angle day-night vision camera from
 Arducam that we suggest using in this configuration comes with two 850nm IR LEDs attached

248 and powered by the camera board (Figure 2B). However, recording through reflective surfaces 249 such as plexiglass across short object distances (e.g., operant box) caused undesirable flare 250 artifacts in the field of view (Figure 4A). To circumvent this, we removed the LED boards from 251 the main camera board and powered them independently using a pair of 3v3 power and ground 252 pins on the Raspberry Pi board (Extended Figure 2-1). This allowed LED placement 253 independent of the camera enabling even and high-quality illumination of the area of interest 254 (Figures 4B-C). This section describes the steps to wire two 850nm LEDs in parallel using 255 custom-made jumper cables and power them with the Pi board itself (Figures 4D-G).

256

257 NOTE: The 3v3 power pin of the Pi board can safely provide up to 500mA of current (according 258 to: https://pinout.xyz/pinout/3v3\_power). Exceeding that limit using high-power LEDs may cause 259 a "brownout" of the Pi and potential safety concerns. Our testing indicated that the two IR LED 260 boards that came with the Arducam day-night vision camera draw ≤ 200mA of current from the 261 3v3 pin when connected in parallel. For higher power LEDs, it is recommended to use either the 262 5v power pin, which provides a higher current draw of about 1.5A (according to: 263 https://pinout.xyz/pinout/5v power), or an external battery pack or power supply unit. For 264 alternative LED options and related hardware, see Extended Table 1-1.

265

#### 266 Step-by-step instructions

Following the step where the LED boards were taken off from the main camera board
 (Figure 2B), cut three segments of 22-gauge Red-Black electrical wire (Figure 4D): (1)
 a short ~3 cm wire to connect the two LED boards in parallel; (2) a long ~80 cm wire
 (adjust to specific installation requirements) for connecting the LED unit to the Pi board
 located some distance from the camera; (3) a short ~6 cm wire to connect wire (2) to a
 pair of 3v3 power and ground pins on the Pi board.

273	2. Split wire (1) down the middle into two separate red and black wires. Split one end of
274	wires (2) and (3) by ~3 cm and the other end of each ~1 cm.
275	3. Crimp the appropriate electrical connectors to the stripped wires as shown in <b>Figure 4D</b>
276	a. Install two non-insulated ring connectors on either end of wire (1).
277	b. Install two ring connectors on the end of wire (2) separated by $\sim$ 3 cm and two
278	male pin connectors housed in one 1x2 plastic housing on the other end.
279	c. Install two female pin connectors each housed in 1x1 plastic housings on the end
280	of wire (3) separated by $\sim$ 3 cm and two female pin connectors housed in one 1x2
281	plastic housing on the other end.
282	NOTE: For detailed instructions on how to crimp ring and pin type connectors, see
283	Extended Figures 4-1 & 4-2.
284	4. Wire the LED boards in parallel as shown in <b>Figure 4E</b> and <b>Figure 4F1</b> .
285	NOTE: Red wires are used for power (+) and black wires for ground (-). Make sure the
286	polarities of all components align before completing the circuit.
287	a. Secure the ring connectors on wires (1) and (2) to the LED boards using the
288	screws that came with camera module.
289	b. Mate the two female pin connectors on wire (3) to any pair of 3v3 power and
290	ground pins on the Pi board 40-pin header (e.g., pins 1 and 6 as shown in <b>Figure</b>
291	<b>4E</b> ).
292	c. Connect wires (2) and (3) via their respective pin connectors to complete the
293	circuit.
294	Test functionality by powering up the Pi USB Cam and confirming that the LED unit is
295	illuminated under low-/no-light conditions.
296	5. Install heat sinks on the back of the LED boards to prevent overheating (Figure 4F).
297	Optionally house the fully wired LED unit in the custom 3D-printed case and install the

fully assembled unit in any behavioral testing site using the 3D-printed mount tools

(Figure 4G).

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#### 301 Multi-camera video acquisition

302 Pi USB Cam affords a high degree of scalability that is often desired for high throughput 303 experiments. Use of the freely available, open-source video acquisition software, OBS (Open 304 Broadcaster Software) Studio enables preview of live video feeds on screen for real-time 305 behavioral monitoring, live-stream video feeds over internet, and simultaneous video acquisition 306 from multiple camera sources into separate local files for offline behavioral analysis. OBS studio 307 is compatible with all three major operating systems; however, we recommend using a Windows 308 PC as the host computer due to added functionalities including video configuration settings that 309 are not available on other platforms. Scalability is limited only by the hardware of the host 310 computer (e.g., number of USB controllers / ports, sufficient CPU, etc). We recommend using a 311 Windows desktop that allows for add-on USB PCIe expansion cards to provide additional USB 312 controllers and greater bandwidth for multi-camera recordings.

The following protocol describes how to set up OBS Studio on a Windows desktop for multi-Pi USB Cam video recordings. For streaming over network, adding audio recording, and many more applications, users can visit the OBS Wiki at <u>https://obsproject.com/wiki/</u>. Note that unless otherwise stated all videos and snapshots of videos included in Figures were acquired at 480p and 30 FPS using OBS Studio.

318

#### 319 Step-by-step instructions

Connect one or more Pi USB Cams to a host Windows desktop that is optionally
 installed with USB PCIe expansion cards for added USB bandwidth (Figure 5A).

To make sure that your multi-camera configuration will not exceed the USB bandwidth
 during recording, open **Device Manager**, click **View** followed by **Devices by**

324 connection, and confirm that no more than three Pi USB Cams are connected to each
 325 Host Controller (Figure 5B).

326 3. Download, install, and launch the latest release of OBS Studio from:
 327 https://obsproject.com (Figure 5C).

NOTE: The default user interface can be customized under the View menu to hide
 unnecessary features such as the Audio Mixer and Scene Transitions.

4. Users can create one or more "profiles" that can save any set of customized recording settings. To do this, go to the **Profile** menu, and click **New (Figure 5D1)**. In the pop-up window, enter a name for the new profile (e.g., "480p30fps" to reflect the recording resolution and frame rate that will be updated in step **5**), uncheck the auto-configuration wizard, and click **OK** to finish creating the new profile (**Figure 5D2**). Once a profile is selected, any changes in recording settings will be automatically saved under that profile.

NOTE: One convenient way to use the "profile" feature is to create one for each
experimental protocol that specifies its own recording needs and settings. Saved
settings for each specific protocol can be quickly applied before each recording session
by simply selecting the appropriate profile.

5. To customize recording settings, click **Settings** on the **Controls** panel (**Figure 5D3**) to open the setting window. **Figures 5D4-6** highlight several changes to the OBS Studio default settings that we recommend for behavior recordings. Click **OK** to save any changes to the recording settings and to close the pop-up window (**Figure 5D7**).

6. In steps 6-9, we provide options to preview and record video from multiple video
sources. OBS Studio refers to content being broadcast at any given time as a "scene"
whereas a configuration of scenes and their respective video sources is referred to as a
"scene collection". Users may want to select multiple scenes and/or scene collections
based on their video needs. For example, multiple video sources can be accommodated

350 within a single scene. This can allow for preview of multiple video sources in tandem. Importantly, recordings in this configuration will include video from each source tiled 351 352 within a single file (Extended Figure 6-1A). Video from multiple sources can also be previewed across separate scenes within a single scene collection. However, OBS 353 354 Studio is only able to record from one scene at any given time in a multiple scene 355 configuration like this (Extended Figure 6-1B). In instances when users want to record 356 video from multiple sources in tandem into separate files, we recommend running 357 multiple scene collections each with a single scene and video source in separate 358 instances of OBS Studio (Extended Figure 6-1C). To create one or more "scene 359 collections" that can save any set of "scenes" and "video sources", go to the Scene 360 Collection menu, and click New (Figure 6A1). In the pop-up window, enter a name 361 unique to your testing apparatus (e.g., "BOX1" for operant box 1) and click OK to finish 362 creating the new scene collection (Figure 6A2).

To add a video source to a scene collection, click on the + button on the Sources panel
(Figure 6A3), and select Video Capture Device (Figure 6A4). In the pop-up window,
enter a name (e.g., "BOX1 cam" for operant box 1 camera) for the new video source,
and then click OK (Figure 6A5). Once the "properties" window shows up, select the right
camera source under Device, make additional changes to the device settings, and click
OK to finish setting up the new video source (Figure 6A6).

# 369 8. Click Start Recording on the Controls panel to start recording and Stop Recording to 370 stop (Figure 6A7).

For multi-camera recording in high throughput experiments (e.g., involving multiple
 subjects in separate testing sites), repeat step 6-7 to create one "scene collection" for
 each camera. Then, launch one more instance of OBS Studio for each additional
 camera by double-clicking the desktop shortcut (Figure 6B1) followed by clicking
 Launch Anyway on the pop-up warning (Figure 6B2). In each new instance, make sure

376to select the "scene collection" that contains the correct camera source for the recording377site of interest (Figure 6B3). To confirm that the recording will not overload the computer378CPU, monitor the CPU usage of each individual instance of OBS Studio provided in the379lower right corner of the OBS interface (Figure 6B4) or in Windows Task Manager.

380

### 381 Frame rate analysis

382 Many neuroscience techniques, such as in vivo calcium imaging, combine video 383 recordings with optical signal to correlate behavioral events with neural activity. The potential for 384 dropped or duplicate frames, which we have experienced with commercially available USB 385 webcams, poses non-trivial challenges for offline data analysis in these kinds of experiments. 386 Recordings with dropped frames appear fast forward and have shorter duration during playback 387 by third-party media players, which often assume a nominal frame rate that is higher than the 388 actual frame rate achieved. Recordings with duplicate frames appear choppy, and thus have 389 lower temporal resolution than desired, despite the high frame rate achieved. Both issues result 390 in additional and unnecessary workload during post-processing in order to accurately align 391 behavioral and neural data. To evaluate the frame rate performance of Pi USB Cam, videos of 392 freely behaving adult male Long-Evans and Sprague Dawley rats were acquired from inside 393 separate operant boxes (MED Associates, St Albans, VT, USA) using a Pi USB Cam and a 394 generic commercial webcam (Logitech C930e webcam, Lausanne, Switzerland). Camera 395 performance was assessed under both red and white house light illumination.

For dropped frame analysis, Synapse (Tucker-Davis Technologies TDT, Alachua, FI, USA), an acquisition platform commonly used in neuroscience research, was used to acquire video recordings from both cameras simultaneously. Five videos of ~5 mins duration each were captured into AVI format in each lighting condition from each camera at the maximum resolution (640x480) and frame rate (20FPS) supported by Synapse. For each recording, the total number of frames and timestamps of each frame were read from Synapse data block using MATLAB 403 matlab/overview/). For each video frame, Synapse stores two timestamps: one for the frame 404 onset and one for offset. The onset timestamp of the very last frame was taken as the recording 405 length, as the offset timestamp of the last frame was stored as inf instead of a real number. The 406 true frame achieved calculated using the following equation: rate was

(https://www.tdt.com/docs/sdk/offline-data-analysis/offline-data-

407  $true FPS = \frac{total frames}{recording length (s)}$ 

TDTbin2mat

402

408 The total number of dropped frames was calculated as:

function

409 total dropped frames = target FPS  $\times$  recording length (s) - 1 - total frames

410 The number of dropped frames per minute was calculated as:

411 dropped frames per min =  $\frac{\text{total dropped frames}}{\text{recording length (s)}} \times 60$ 

412 The video file length when played in third-party media players was calculated as:

413 video file length (s) =  $\frac{\text{total frames}}{\text{target FPS}}$ 

414 For duplicate frame analysis, OBS Studio was used to acquire five videos of ~5 mins 415 duration each into mp4 format in each lighting condition from each camera at 640x480 416 resolution and 30 FPS. Visual inspection of videos from each camera made clear that those 417 acquired with the commercial webcam contained abundant duplicate frames, whereas those 418 acquired with Pi USB Cam were essentially devoid of duplicate frames. To quantify this, a 419 custom MATLAB script was used to extract relevant information from each recording, including 420 the recording length and total number of frames, and to identify duplicate frames. Color video 421 files were first converted to grayscale and the frame-by-frame difference in grayscale intensity 422 was calculated for each pixel. Plotting the frequency distribution of maximum change in pixel 423 intensity revealed a bimodal distribution apparent only in videos acquired with the commercial 424 webcam. Using the local minimum as a guide, we identified a threshold for maximum pixel 425 intensity change of 8 for videos acquired under red house light illumination and 10 for videos 426 acquired under white house light illumination. Frames that contain a maximum pixel intensity

427 change below or equal to these thresholds were algorithmically identified as duplicates, which 428 matched the duplicates identified manually in videos acquired with the commercial webcam. 429 The true frame rate of each video, which discounts the duplicate frames and more accurately 430 reflects the temporal resolution, was calculated using the equation:  $true \ FPS = \frac{total \ frames-total \ duplicate \ frames}{recording \ length \ (s)}$ 431

432 The number of duplicate frames per second was calculated as:

433 duplicate frames per min = 
$$\frac{\text{total duplicate frames}}{\text{recording length (s)}} \times 60.$$

- 434 Results were expressed as mean ± SEM.
- 435

#### 436 Fisheye distortion correction

Fisheye camera lenses, such as the one used in the recommended Arducam day-night vision camera, allow for capture of a large field of view given a limited object distance. However, they often produce images that are radially distorted, which may pose challenges to accurate position tracking. Here, we describe a simple method to digitally correct fisheye image distortion using a free, open-source OBS Studio plugin, the OBS ShaderFilter.

#### 442 Step-by-step instruction:

On a Windows PC installed with OBS Studio, download the latest release of OBS
 ShaderFilter plugin from its GitHub page: <a href="https://github.com/Oncorporation/obs-shaderfilter">https://github.com/Oncorporation/obs-shaderFilter</a> (Extended Figures 8-1 A1-2), unzip the package file, and drag and drop its
 contents to the OBS program file directory (Extended Figure 8-1 A3). The default file
 location is C:\Program Files\obs-studio. Replace duplicate files if necessary
 (Extended Figure 8-1 A4).

2. Next, download the entire repository from its GitHub page and unzip (Extended Figure
8-1 B1). Locate the "fisheye.shader" text file under the obs-shaderfiltermaster\data\examples directory, drag and drop to the OBS program file directory at

452		C:\Program Files\obs-studio\data\obs-plugins\obs-
453		shaderfilter\examples to store alongside other shader filters (Extended Figure 8-
454		1 B2).
455	3.	Launch OBS Studio and add a video source if you have not (Extended Figure 8-1 C1;
456		Figure 6A). To import pre-recorded videos for offline fisheye correction, add a "Media
457		Source" as the video source (Extended Figure 8-1 C2). To configure a fisheye camera
458		for real-time fisheye correction during recording, add a "Video Capture Device" as the
459		video source (Extended Figure 8-1 C2).
460	4.	Right click the video source and select the "Filters" option (Extended Figure 8-1 C3). In
461		the pop-up window, under the "Effect Filters" header, click the "+" button to add a "User-
462		defined shader" (Extended Figure 8-1 C4), which can then be renamed to "Fisheye
463		correction" for clarification (Extended Figures 8-1 C5).
464		NOTE: If the "User-defined shader" is missing, repeat Steps 1 & 2 to make sure the
465		plugin is correctly installed.
466	5.	Select the option to "Load shader test from file" and click "Browse" to locate and load the
467		"fisheye.shader" text file. Adjust the "power" parameter to enhance or reduce fisheye
468		effect (Extended Figure 8-1 C6).
469		NOTE: A positive power adds more fisheye radial distortion while a negative power
470		corrects distortion. A power of zero means no change to the original image. See
471		Extended Figure 8-2 for example power settings.
472	6.	In the main OBS Interface, press "Start Recording" to record a new video if a camera
473		has been selected as the source or re-record a video with fisheye distortion corrected if
474		a pre-recorded video file has been selected as the source (Extended Figure 8-1 C7).
475		
476	Posit	ion tracking and locomotor activity measurement

To assess the effects of fisheye distortion and digital correction on locomotor activity measurement, position tracking was performed on videos with low distortion, fisheye distortion, and distortion digitally corrected. Five videos of ~5 mins duration of adult female Long-Evans rats exploring two contextually distinct compartments in a standard conditioned place preference apparatus (MED Associates, St Albans, VT, USA) were acquired in OBS Studio from two Pi USB Cams in tandem. One camera was equipped with a 70° HFOV low-distortion lens and the other with a 100° HFOV fisheye lens (Arducam Technology Co., Limited, Hong Kong, China; **Extended Table 1-1**). Videos with fisheye distortion were subsequently corrected using the method described above. Position and locomotor measures were tracked offline using ANYmaze software (Stoelting Co., Wood Dale, IL, USA). Each measure obtained was averaged across all five videos and compared using a one-way ANOVA. For real-time position tracking, a Pi USB Cam was directly interfaced with ANY-maze as

488 For real-time position tracking, a Pi USB Cam was directly interfaced with ANY-maze as
489 a USB camera to provide live video feed.

#### 490 RESULTS

#### 491 Pi USB Cam offers superior video quality & performance

492 Of significant importance to our research needs was an affordable solution that 493 performed better under low-/no-light conditions within limited object distance compared to 494 commercially available webcams. Pi USB Cam outperformed the Logitech C930e webcam on 495 several measures of significance to behavioral neuroscience research. Monitoring of a standard 496 rat operant testing apparatus with a working area of 11.625" L x 9.78" W x 7.35" H was 497 successfully accomplished with the Pi USB Cam mounted overhead using the out-of-the-box 498 170° (DFOV) × 140° (HFOV) fisheye lens. Notably, in this orientation, the camera was placed 499 less than 1 cm above the testing apparatus therefore requiring essentially no additional vertical 500 space for video acquisition (Figure 7A). In contrast, the commercial counterpart, equipped with 501 a 90° DFOV lens, necessitated ~20 cm of vertical space to capture a similar field of view. 502 Moreover, positioning of the Pi USB Cam allowed for unobstructed access to the roof opening 503 enabling unimpeded movement of tethered animals, whereas angled placement of the Logitech 504 webcam was required to avoid collision with the commutator and tether.

505 Camera performance was qualitatively accessed under no-visible light condition (Figure 506 **7B**), and several standard low-visible light conditions inside an operant box including cue light 507 illumination (Figure 7C), red house light illumination (Figure 7D), white house light illumination 508 (Figure 7E), and white house light + cue light illumination (Figure 7F). With adequate IR 509 illumination, Pi USB Cam provided high image quality regardless of the level of the ambient 510 visible light. In contrast, the Logitech webcam was unable to perform in the no-light condition 511 and image quality was compromised under red house light illumination.

512 Pi USB Cam also outperformed the commercial webcam in terms of frame rate 513 maintenance. Unlike the Pi USB Cam, the commercial webcam was unable to maintain the set 514 frame rate of 20 FPS when interfacing with Synapse, losing on average 505.60  $\pm$  69.40 frames 515 per min under white house light illumination and 702  $\pm$  0.00 frames per min under red house 516 light illumination (Table 3). This resulted in video files that appear fast forward and shortened 517 when played offline by third-party media players that assume a constant, nominal frame rate of 518 20 FPS (Movie 1). Pi USB Cam, however, maintained a constant 20 FPS across all trials under 519 both lighting conditions. In contrast to Synapse, OBS Studio was able to achieve the maximum 520 frame rate of 30 FPS with either camera without dropping frames, as determined by the ratio of 521 total number of captured frames to recording length (data not shown). However, videos 522 recorded with the commercial webcam exhibited a high degree of duplicate frames. On average, 523 the webcam contained 1300.20 ± 1.20 duplicate frames per min under white house light 524 illumination and 1303.40 ± 0.24 duplicate frames per min under red house light illumination 525 (Table 4). As a result, these videos appear choppy during playback reflecting reduced temporal 526 resolution despite the high frame rate achieved (Movie 2). Importantly, this analysis cannot 527 distinguish between duplicate frames and instances when the animal does not move between 528 two frames. However, it should be noted that videos acquired with Pi USB Cam were judged to 529 be free of duplicate frames upon visual inspection. A similar algorithmic analysis of these videos 530 failed to uncover a clear threshold suggestive of duplicates, as their frequency distributions of 531 maximum change in grayscale pixel intensity appear unimodal as opposed to bimodal. 532 Nevertheless, when the same thresholds used for the commercial webcam were applied to 533 these videos, an average of 466.20 ± 43.24 frames per min were identified for videos under red 534 house light illumination and 310.40 ± 100.74 frames per min for videos under white house light 535 illumination. Not only was the number of identified frames much lower (64-76%) than that 536 observed with the commercial webcam, but this value also varied greatly from video to video. 537 Frames identified as duplicates were also unevenly distributed unlike those observed in videos 538 acquired using the commercial webcam. Combined with visual inspection, these suggest that 539 the algorithmically identified frames in Pi USB Cam videos reflect a lack of animal movement 540 rather than duplicate frames.

541

#### 542 Pi USB Cam is highly customizable for individual recording needs

The recommended Arducam day-night vision camera can produce high quality video images under both bright and low-/no-light conditions with relative ease (Figures 7, 9-11, **Movies 3-4**) and can also be permanently set to engage or disengage the IR filter (Figure 3A). Moreover, the ability to physically separate the accompanying IR LEDs from the camera body allows for flexibility in illumination options under low-/no-light conditions (Figures 4, 10D-F).

548 We also benchmarked several M12 sized lenses compatible with the Arducam day-night 549 vision camera (see list in Extended Table 1-1), each of which is associated with a different field 550 of view and accompanying degree of image distortion. Our research needs necessitate 551 positioning of the Pi USB Cam off-center from the testing arena to accommodate for a tether 552 accessed through the roof opening. However, this orientation has the potential to result in 553 uneven image distortion across the field of view as distortion tends to be minimal at the center 554 of the fisheye field of view and progressively enlarged toward the radial edge of the image 555 (Clemmensson et al., 2020). Therefore, comparison of different lenses was performed with the 556 camera placed directly above the center of the arena at the level of the plexiglass roof about 20 557 cm above the grid floor measuring 11.5" L x 10.25" D x 1.75" H. As shown in Figure 8, we found 558 that the default lens (140° HFOV) struck the best balance between an adequate field of view to 559 capture the majority of the area of interest and an acceptable amount of image distortion to 560 enable accurate behavioral tracking. Comparison of the object distance required to obtain a 561 similar field of view across different M12 fisheye lenses is provided in Extended Figure 8-2.

Using the default lens, Pi USB Cam was also able to capture a generous field of view when positioned for side viewing (at a distance of about 5 cm away from the plexiglass wall) (Figure 9, Movie 3). However, in environments where object distance is not a limiting factor or position accuracy is a primary concern, users can opt for lenses with a narrower field of view and lower image distortion, or lenses designed specifically for minimum distortion (see **Extended Table 1-1)**. For example, overhead monitoring of a standard conditioned place preference testing apparatus with a working area of 32.70" L x 8.25" W x 8" H, we found that a 100° (HFOV) fisheye lens was ideally suited to capture the entire testing arena when the camera was positioned ~30 cm overhead (Figure 11, Extended Figure 8-3, Movie 5-6).

571

## 572 Fisheye distortion correction allows for accurate position tracking and locomotor activity 573 measurement

574 As an alternative to using low-distortion lenses, which often require larger object 575 distance that is incompatible with many experimental set ups, fisheye distortion can be digitally 576 corrected using the OBS ShaderFilter plugin (Extended Figures 8-1, 8-2, and 8-3, Movie 5) as 577 well as other widely available image processing algorithms. Benchmarked against a low-578 distortion M12 lens, the fisheye image distortion from a 100 °HFOV lens and digital fisheye 579 correction imparted minimal effects on position tracking efficiency (Extended Figures 8-3 A-C, 580 Movie 5). One-way ANOVA of various locomotor measures revealed a significant between 581 group difference for distance travelled in the white side of the testing apparatus [F(2,4) = 6.538]582 p = 0.0462] (Extended Figure 8-3 D). However, post-hoc comparisons failed to identify a 583 significant difference between pre-correction and low-distortion (Dunnett's test, p = 0.0918) or 584 post-correction and low-distortion (Dunnett's test, p = 0.0783). While no other statistically 585 significant differences were observed, visual inspection of the data makes clear that the 586 difference between pre-correction and low-distortion is lessened by digital correction. Therefore, 587 digital fisheye correction is likely to improve tracking accuracy in experiments where absolute, 588 rather than relative, measures are a high priority.

589

## 590 Custom 3D-printed components afford flexible installation options tailored to individual 591 needs

592 Our custom 3D-printed components (**Table 2**) provide added protection and allow Pi 593 USB Cam to be securely mounted on a variety of surfaces or structures. Using these 594 components, Pi USB Cam can be installed on a commutator balance arm post (Figures 9A, C), 595 a ring stand (Figure 10A), a wire shelf (Figures 10D, 11A), or any flat surface (Figures 9B, D). 596 Moreover, the hinged camera mount components provide ample degrees of freedom to finely 597 adjust camera positioning for optimal image acquisition. Thus, use of our custom 3D-printed 598 components ensures Pi USB Cam is readily adaptable to virtually any recording condition. This 599 includes recording within the limited space around a standard operant box inside a sound 600 attenuating cabinet (Figure 9, Movie 3), and many other common behavioral testing sites such 601 as a home cage environment (Figure 10, Movie 4) or larger scale testing arenas like a 602 conditioned place preference (CPP) apparatus (Figure 11).

603

#### 604 Pi USB Cam is highly scalable for multi-subject multi-site recording needs

605 Using the free, open-source software, OBS Studio, we were able to successfully video-monitor 606 in real-time eight freely behaving rats in separate operant boxes with eight Pi USB Cams 607 operating simultaneously from a single host computer (Figure 12A). Acquired recordings were 608 subsequently saved into individual video files for further offline analysis. Using our settings 609 (Figure 5D), a 29 min recording produced on average 738.5 MB worth of video file in mkv 610 format (data not shown). At any given moment, each instance of OBS Studio used between 3-611 6% of the six-core 3.20GHz CPU on our host computer and the overall CPU usage never 612 exceeded 50% when no other major application was running at the same time (Figures 12B-C). 613 Thus, the only major limiting factors to scaling Pi USB Cam are the USB bandwidth and CPU of 614 the host computer.

#### 615 **DISCUSSION**

616 Pi USB Cam is an affordable, DIY video recording solution that combines simple 617 electronics and 3D printing to enable video monitoring of behavior in diverse recording 618 environments under any lighting condition. Our detailed build instructions are easy to follow and 619 require no specialized expertise. Camera components and accessories are easily sourced from 620 globally accessible vendors. In addition, because DIY components are often discontinued, we 621 provide an extensive list of alternatives that can serve as substitutes if circumstances require. 622 Using this design, we demonstrate its ease of use as a plug-and-play USB camera, with notable 623 superiority over a generic commercial webcam in terms of field of view, IR sensitivity, frame 624 rate, and overall flexibility to meet individual research needs. Lastly, we show that Pi USB Cam, 625 in combination with free, open-source video acquisition software, is easily scalable for multi-626 subject and multi-site recordings.

627 Hardware flexibility is the main advantage of Pi USB Cam over commercially available 628 webcams. Indeed, despite their out-of-the-box user friendliness, the hardware of most 629 commercial webcams is simply not designed to acquire high quality video recordings in confined 630 spaces and/or poor lighting conditions. In contrast, Pi USB Cam can be used with a wide range 631 of camera modules that offer IR sensitivity for low-light recording, IR correction for bright-light 632 recording, fisheye lenses for wide-angle recording, low-distortion lenses for accurate position 633 tracking, etc. Due to its DIY nature, the cost of building Pi USB Cam is comparable to, if not 634 more affordable than, repurposed commercial webcams and a fraction of the cost of video 635 capture systems specialized for neuroscience research (Extended Table 1-2). This is 636 particularly important given that camera costs can present significant challenges to scalability 637 and throughput. Augmented by the burgeoning technology of 3D printing, Pi USB Cam can be 638 installed in various commonly used behavioral testing and housing settings without the need for 639 additional modifications to the testing apparatus or additional costly parts.

At the heart of the software design, the Show-me webcam firmware enables Raspberry Pi cameras to become an out-of-box, plug-and-play USB camera. In contrast, most, if not all, other DIY solutions require some level of programming proficiency to unlock even the most basic functionalities of the microcomputer and related hardware (Saxena et al., 2018; Singh et al., 2019; Weber and Fisher, 2019; Clemensson et al., 2020; Centanni and Smith, 2021). While DIY solutions tend to turn researchers away due to the steep learning curve associated with such requirements, Pi USB Cam ensures novices need not reinvent the wheel. As a USB camera, Pi USB Cam can be readily integrated into pre-existing video recording systems, ranging from the popular open-source recording/streaming app OBS Studio to the professional neural/behavioral recording software Synapse. As such, limited only by the specifications of the host recording computer, Pi USB Cam can be readily scaled to facilitate multi-subject, multi-site, high-throughput experimental designs. Depending on the recording software of choice, users of Pi USB Cam have the option to watch live video feeds for real-time behavioral monitoring on screen or via network streaming. Users also have the freedom to save video recordings in their preferred file format and location where they can be accessed for offline analysis using sophisticated behavioral tracking algorithms such as ezTrack (Pennington et al., 2019) and DeepLabCut (Mathis et al., 2018). For real-time applications that rely on live video feeds, Pi USB Cam is again able to integrate as a plug-and-play USB camera with powerful, yet widely available neuroscience research applications like ANY-maze, which combine real-time video tracking with various control devices (e.g., optogenetic laser) to achieve closed-loop neural/behavioral manipulation (see Movie 6 for example). Although not tested here, Pi USB Cam is also compatible with recently developed open-source video tracking and control systems, which readily support USB cameras including DeepLabCut-Live (Kane et al., 2020) and DeepLabStream (Schweihoff et al., 2021).

664 While the Pi USB Cam offers an easy-to-use, flexible, and affordable option for 665 behavioral neuroscientists to acquire video recordings, several limitations of our system should 666 be noted. Previous approaches using Raspberry Pi cameras are designed such that the 667 microcomputer performs the heavy lifting of video encoding (Saxena et al., 2018; Singh et al., 668 2019; Weber and Fisher, 2019; Clemensson et al., 2020; Centanni and Smith, 2021). The 669 advantage of such a design is that it has no inherent limits on scalability other than the number 670 of cameras an individual can purchase. In contrast, Pi USB Cam requires a standalone host 671 computer to perform recordings. In addition to this expense and the footprint associated with a 672 host computer in close proximity to behavioral testing apparatuses, the number of video streams 673 that can be encoded and stored in tandem is limited by the host computer's processing power 674 and bandwidth. While such a configuration could be problematic for some research needs, we 675 felt that function similar to a commercial webcam makes Pi USB Cam more user friendly and 676 approachable than standalone alternatives. Moreover, connection with a host computer 677 provides significantly greater ease of real-time video monitoring than standalone Raspberry Pi 678 cameras. While Show-me webcam is more than adequate for video recording, it does not 679 currently support audio capture. Although this could change in a later release of the firmware, 680 currently video recordings requiring audio measures (e.g., ultrasonic vocalizations, audio cues) 681 necessitate use of a standalone microphone to capture audio independent of video feed, which 682 can then be synchronized online or offline depending on the recording software used. As with 683 any open-source DIY solution, Pi USB Cam software will require regular and timely updates in 684 tandem with upgrades to Raspberry Pi hardware and operating system. However, the well-685 established open-source community of Show-me webcam developers has a strong history of 686 providing regular support and upgrades for the firmware. This is unlike previous niche DIY video 687 solutions, which have often relied on a single individual to perform upgrades and consequently 688 have had difficulty surviving beyond initial hardware and operating system versions (Singh et al., 689 2019). Finally, our custom 3D-printed case and mount tools require access to a quality 3D 690 printer. However, as the technology of 3D printing matures, small-scale consumer printers are

becoming increasingly more affordable, and larger-scale industrial fee-for-service printers areoften offered at universities/institutions.

In summary, Pi USB Cam is a highly versatile and affordable DIY video recording solution for real-time behavioral monitoring and offline analysis. Requiring minimum time, expertise, and financial commitment to implement, Pi USB Cam offers behavioral neuroscientists a powerful, yet simple, solution for high quality and high-throughput behavioral data collection. We encourage users to reference the current manuscript when implementing Pi USB Cam in their own experiments.

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727

#### 729 FIGURE LEGENDS

730 Movie 1. Comparison of Pi USB Cam and commercial webcam performance using specialized neural recording software for video acquisition. 731 732 733 Movie 2. Comparison of Pi USB Cam and commercial webcam performance using OBS 734 Studio 735 736 Movie 3. Example video showing versatile implementation of Pi USB Cam for behavioral 737 monitoring. 738 739 Movie 4. Example video showing versatile implementation of Pi USB Cam for rodent 740 home cage monitoring. 741 742 Movie 5. Example video showing position tracking performed on a video acquired with a 743 fisheye lens before and after distortion correction, and a video obtained with a low-744 distortion lens. 745 746 Movie 6. Example video showing real-time closed-loop behavioral control by a commonly 747 used video-tracking system combined with Pi USB Cam. 748 749 Figure 1. Camera software setup. (A) Insert a clean micro-SD card into a computer. (B) 750 Download the latest release of the Show-me webcam image file from its official GitHub page. 751 (C) Install the Show-me webcam image file on the micro-SD card using the official Raspberry Pi 752 Imager. Image source: https://github.com/raspberrypilearning/components

754 Figure 2. Camera hardware setup. (A) Essential components required to build a Pi USB Cam 755 including the main Raspberry Pi board, a USB to USB-C cable, a micro-SD card, the camera 756 module, and a camera ribbon flex cable (listed from left to right). (B) Remove the attached IR LEDs from the main camera board by unscrewing the four screws outlined in red. (C) Connect 757 the main camera board to the Raspberry Pi 4B board via a camera ribbon flex cable. See 758 759 Extended Figure 2-1 for a labeled diagram of the Pi motherboard. (D) Insert the prepared micro-760 SD card (see Figure 1 for software setup) into the Raspberry Pi board. (E) Power up the Pi USB 761 Cam by connecting it to a computer using the USB cable. (F) House the camera in custom 3D-762 printed case and mount tools for protection and installation in behavioral testing environment.

763

764 Figure 3. Adjusting camera settings. (A) Manually enable IR sensitivity by covering the 765 photoresistor with non-translucent tape (1) or enable IR correction by unplugging the connector 766 on the back of the camera (2). (B) Use of our recommended low-light custom settings (right) 767 eliminates slightly purple hue obtained using the camera's default settings (left) when recording 768 in total darkness. (C) In contrast, the same low-light settings produce an unwanted yellow hue 769 (right) under bright light conditions when default settings (left) produce a more appropriate 770 image. (D) To adjust camera settings, connect the Pi USB Cam containing the micro-SD card 771 into a host computer. (E) Identify the COM port for the Pi USB Cam in Windows Device 772 Manager. (F) Connect to the Pi USB Cam using the open-source software PuTTY. (G) Enter the 773 command shown in (1) to access all adjustable camera setting (2). Settings we recommend 774 adjusting for low-light recordings are highlighted in red. (H) Adjust the focus by unscrewing the 775 small screw that secures the lens in place (arrow) and twisting the lens in either direction until 776 your desired image quality is achieved. \*Recommended settings for each lighting condition.

777

Figure 4. Wiring IR LEDs independent from Pi USB Cam. (A) Unwanted flare artifacts are apparent when IR LED boards remain attached to and powered directly by the camera board

780 and the camera is mounted over a reflective surface. Detaching the IR LEDs from the camera 781 board allows for flexible placement in a configuration that avoids these flares as well as 782 shadows cast by other equipment such as what is observed when the LEDs are mounted 783 overhead (B) versus away from the reflective surface (C). (D) Custom-made jumper wires (1-3) 784 necessary to wire the IR LED boards in parallel and power them via a pair of 3v3 power and 785 ground pins on the Pi board. See Extended Figure 4-1 and 4-2 for additional wiring instructions. 786 (E) Fully connected IR LED unit and Pi board. The locations of 3v3 power pins (highlighted in 787 pink) and ground pins (highlighted in in black) on the 40-pin header are illustrated in the inset. 788 (F) Heat sinks should be installed on the back of the LED boards (1) to prevent overheating 789 after housing them in the custom 3D printed case (2). (G) CAD rendering of the IR LED housing 790 and mount parts (1) and a close-up photo of a fully assembled and mounted IR LED unit (2).

791

792 Figure 5. Set up for multi-camera recordings. (A) The following steps should be done in OBS 793 Studio from a host computer connected to one or more Pi USB Cams. (B) Verify in the Windows 794 Device Manager that no more than three cameras are connected to each USB controller. (C) 795 Main OBS Studio interface. Menu, Sources, and Controls panels are highlighted. Users can 796 generate a "Profile" from the drop-down menu (D1-2) and use the "Controls" panel to access 797 various recording settings (D3-7). Image source: https://github.com/obsproject/obs-798 studio/blob/master/UI/forms/images/obs 256x256.png

799

Figure 6. Recommended configuration for separate recordings from multiple video sources. For each Pi USB Cam, create a "Scene Collection" from the drop-down menu (A1-2) and add the camera as a video source using the "Sources" panel (A3-7). (B) Launch additional instances of OBS Studio to record from multiple camera sources. See Extended Figure 6-1 for a detailed explanation of OBS Studio configurations.

Figure 7. Video quality comparison between Pi USB Cam and commercial webcam.
Snapshots of videos acquired using Pi USB Cam (left column) and Logitech C930e webcam
(right column) mounted overhead at a distance that accommodated the entire field of view (A).
Recordings were made under (B) no light, (C) cue light illumination, (D) red light illumination, (E)
white light illumination, and (F) white light illumination + cue lights.

811

812 Figure 8. Comparison of different Pi USB Cam-compatible fisheye lenses. Pictures of a Pi 813 USB Cam equipped with various M12 fisheye lenses (1) including 180° (A), 140° (B), 118° (C), 814 100° (D), 73° (E), 67° (F), 33° (G), and 26° (H). Corresponding snapshots of videos acquired 815 from a centered position overhead of the arena at a distance of ~20 cm from the rod floor are 816 depicted for each lens (2). \*Indicates the default lens that comes with the Arducam day-night 817 vision camera. See accompanying Extended Figures for digital fisheye distortion correction (8-818 1), comparison of lenses at different object distances (8-2), and position tracking comparisons 819 under distorted and low-distortion video acquisition settings (8-3).

820

821 Figure 9. Camera implementation for operant box monitoring. Use of custom 3D-printed 822 components allows for versatile camera installation options including overhead (A-B) and side 823 (C-D) mounted configurations. For each option, (1) depicts the CAD drawing of 3D printed 824 components. Close-up photos of each configuration are provided in (2) with object distance 825 indicated in (3). For overhead viewing, Pi USB Cam can be mounted on a commutator balance 826 arm post (A) or directly on the roof panel (B). Similar post (C) and wall (D) mount options are 827 available for side view configuration. Both overhead (E) and side view (F) configurations allow 828 for full view of the operant arena. Video snapshots acquired under no-light conditions.

829

Figure 10. Camera implementation for home cage monitoring. Custom 3D-printed components can also be configured to accommodate home cage recordings in a variety of 832 settings including mount to a ring stand (A-C) for recordings performed offsite (e.g., testing 833 room) and on wire shelving (D-F) for recordings inside the vivarium. For each option (1) depicts 834 the CAD drawing of 3D printed components. Close up photos of each configuration are provided 835 in (2) with object distance indicated in (3). Pi USB Cam is easily mounted to a ring stand (A) to 836 accommodate offsite recordings in the home cage shown here in both bright-light (B) and no-837 light (C) conditions. Note that in this configuration the IR LEDs are used in the default 838 configuration such that they are attached to and powered directly by the main camera board. 839 Using the custom 3D-printed G clamp, Pi USB Cam (and independent IR LEDs) can also be 840 mounted directly to shelving (D) shown here in both bright-light (E) and no-light (F) conditions.

841

**Figure 11. Camera configuration for large apparatus video recordings.** Together with custom 3D-printed components, Pi USB Cam can be configured to record from large behavioral testing arenas like the conditioned place preference apparatus shown here. **(A1)** CAD drawing of the 3D printed components used in this configuration. **(A2)** Close-up photo of Pi USB Cam mounted overhead on a wire shelf. **(A3)** The entire testing arena is visualized overhead with the camera mounted at a distance of ~30 cm using a 100° HFOV fisheye lens. Video snapshots acquired with this configuration under bright-light **(B)** and no-light **(C)** conditions.

849

850 Figure 12. Pi USB Cam scalability is limited only by USB bandwidth and host computer 851 specifications. (A) Multi-subject multi-site recordings are easily achieved using the free and 852 open-source video capture software OBS Studio depicted here with eight independent Pi USB 853 Cams installed in eight separate operant boxes. (B) Windows Task Manager shows the CPU 854 usage of each instance of OBS Studio during multi-camera recordings (n=8) using the same 855 video acquisition settings shown in Figure 5D and a host computer with the specifications 856 depicted in (C) including CPU, memory (1), and add-on USB controllers from a USB PCIe 857 expansion card (2).

858

**Table 1. Store-bought components list.** Vendor, catalog number and price for all store-bought components used in current build. See Extended Table 1-1 for a comprehensive list of parts plus alternative options and additional accessories. See Extended Table 1-2 for cost estimates for complete build.

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Table 2. Custom 3D-printed components. Comprehensive list of all 3D-printed components
 used in the current build. STL files and print instruction are accessible at
 <a href="https://www.thingiverse.com/gloverlab/designs">https://www.thingiverse.com/gloverlab/designs</a>.

867

Table 3. Dropped frame comparison between Pi USB Cam and commercial webcam. 5minute videos (640x480 resolution, 20 FPS, avi format) were recorded from each camera via Synapse software for five trials under red and white house light illumination. Results are expressed as mean ± SEM.

872

Table 4. Duplicate frame comparison between Pi USB Cam and commercial webcam. 5minute videos (640x480 resolution, 30 FPS, mp4 format) were recorded from each camera via
OBS Studio for five trials under red and white house light illumination. Results are expressed as
mean ± SEM.

877

878 Extended Figure 2-1. Diagram of the Raspberry Pi 4B motherboard. Image source:
 879 <a href="https://github.com/raspberrypi/documentation/blob/develop/documentation/asciidoc/computers/o">https://github.com/raspberrypi/documentation/blob/develop/documentation/asciidoc/computers/o</a>
 880 <a href="sylutions-sylution-syluta-sylution-sylution-sylution-sylution-syluta-sylution-syluta-sy

881

882 Extended Figure 4-1. Step-by-step instructions for crimping ring terminal connectors. (A)
883 Gather all essential parts: (1) electrical wire AWG22, non-insulated ring terminal connector

36

884 AWG22-16 #4 stud size, heat shrink tubing 1/8", (2) Astro crimping tool with B-Jaw for non-885 insulated terminals, and wire stripper. (B-D) Strip the wire to expose ~4 mm of conducting wire, 886 comparable to the length of the wire barrel of the connector. (D) Cut one short segment of 1/8" 887 heat shrinking tubing that is long enough to cover the entire wire barrel ( $\geq$  6 mm) and put it on 888 the wire before crimping. (E) Crimp the connector to the bare wire using the first die (DIN 0.5-889 1.5mm<sup>2</sup>) on the B-Jaw of the Astro crimping tool. (F) Make sure to visually inspect and perform 890 a gentle pull test to confirm the crimp is successful. (G) Fully cover the entire wire barrel with 891 heat shrink tubing and use a heat gun to shrink the tubing.

892

893 Extended Figure 4-2. Step-by-step instructions for crimp pin terminal connectors. (A) 894 Gather all essential parts: (1) electrical wire AWG22, male or female pin terminal connector, 895 plastic housing, (2) Astro crimping tool with H-Jaw for open barrel terminals, and wire stripper. 896 (B-C) Strip the wire to expose ~2.5mm of conducting wire. (D) Insert the stripped wire into the 897 pin terminal connector while making sure that the bare wire falls within the wire barrel of the 898 connector and the wire insulation is inside the insulation barrel. Gently bend the insulation barrel 899 around the wire insulation to prevent connector or wire from moving out of place during 900 crimping. (E) Crimp the connector to the wire using the middle die (DIN 0.5mm2) on the H-Jaw 901 of the Astro crimping tool. Make sure that the open barrel is facing towards the "nest" of the 902 crimping die and both wire barrel and insulation barrel are positioned in the appropriate spots of 903 the crimping die. (F) Visually inspect and perform a gentle pull test to confirm the crimp is 904 successful. (G) Insert the crimped connector into a plastic housing. Visually inspection and 905 gentle pull test should be performed to make sure that the connector is securely housed in order 906 to avoid issues with mating pins.

907

908 Extended Figure 6-1. Schematics showing several options to preview and/or record from 909 multiple video sources. (A) One scene with multiple video sources operating within one 910 instance of OBS Studio recorded into a single video file. (B) Multiple scenes each with their own 911 video source operating within one instance of OBS Studio. Recording produces video from a 912 single scene / video source. (C) Multiple scene collections each with their own video source 913 running in independent instances of OBS Studio produce independent video files. Image 914 source: <u>https://github.com/obsproject/obs-studio/blob/master/UI/forms/images/obs\_256x256.png</u> 915

916 Extended Figure 8-1. Digital correction of fisheye distortion. (A) Download the OBS 917 ShaderFilter plugin from its GitHub page and install on a Windows PC equipped with OBS 918 Studio. (B) Download the "fisheye.shader" text file located in its GitHub repository. In the main 919 OBS interface, add a pre-recorded video as a "Media source" for offline fisheye correction or a 920 camera as a "Video Capture Device" for real-time fisheye correction (C1-2). Enable the 921 ShaderFilter plugin and fisheye correction for each video source (C3-7).

922

923 Extended Figure 8-2. Comparison of Pi USB Cam-compatible fisheye lenses in terms of 924 object distance and fisheye correction. Pictures showing the object distance of a Pi USB 925 Cam (1) equipped with various M12 fisheye lenses including 180° (A), 140° (B), 118° (C), 100° 926 (D), and 73° (E) for overhead viewing in a standard operant box. Snapshots of raw videos 927 acquired from a centered position at the corresponding object distances showing comparable 928 captured fields (2), and the same videos after the fisheye image distortion was digitally 929 corrected using the OBS ShaderFilter plugin (3). Power settings used are indicated on each 930 image. \*Indicates the default lens that comes with the Arducam day-night vision camera.

931

Extended Figure 8-3. Effects of fisheye distortion on position tracking and locomotor
measures. Snapshots of ANY-maze position tracking (1) performed on a video acquired with a
100° HFOV fisheye lens without distortion correction (A), after digital distortion correction (B),
and from a video acquired in tandem using a 70° HFOV low-distortion lens (C). Representative

38

936 center-point tracking plots (2) and heatmaps (3) from the same video show similar results. (D)
937 Effects of fisheye distortion and correction on position tracking accuracy were demonstrated by
938 comparing various locomotor activity measures, including the total distance travelled (1) and
939 average speed (2) during the entire test duration, as well as the total distance travelled (3-4),
940 average speed (5-6), and time spent (7-8) in either side of the testing apparatus.

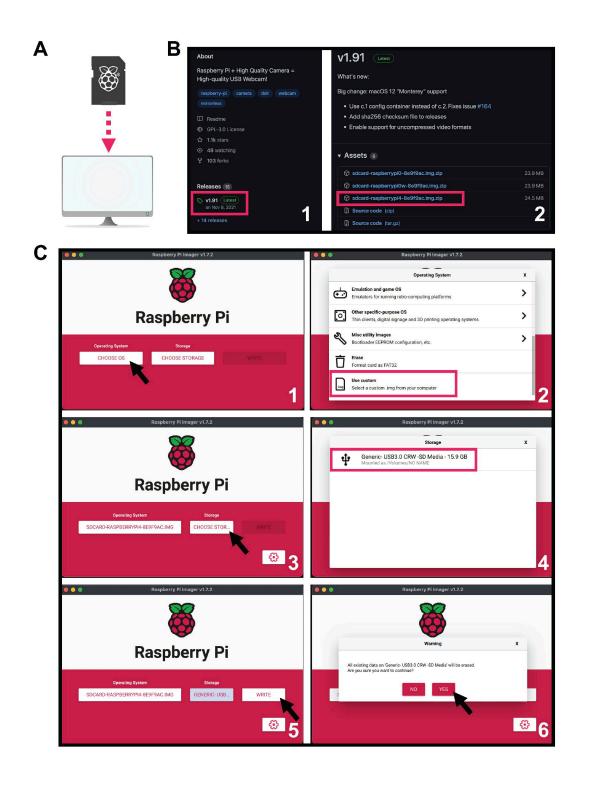
941

942 Extended Table 1-1. List of store-bought components including alternative options and 943 accessories.

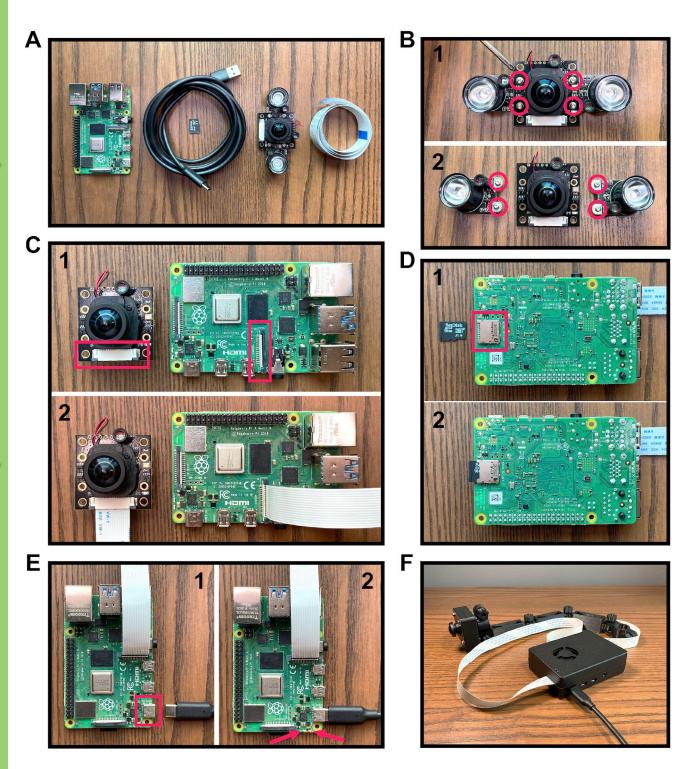
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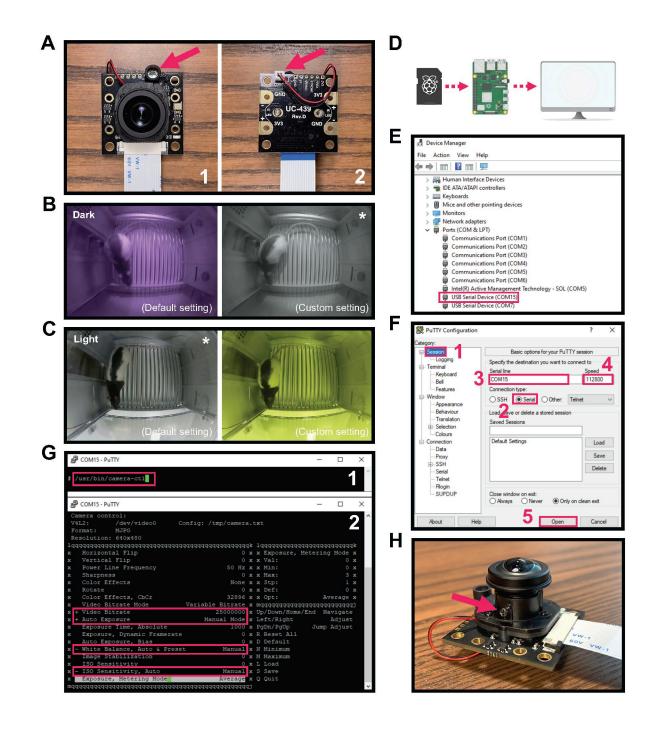
945 Extended Table 1-2. Pi USB Cam Expenses. Laboratories can choose equipment based on 946 budget constraints. Tools and supplies are listed separately because they are only required if 947 users intend to use the IR LEDs independently from the camera as shown in Figure 4 and/or if 948 laboratories are not already stocked with these items. Note that the grand total (n=8) for the 949 upper bound includes the cost of one set of tools and supplies as well as the cost for eight sets 950 of essential equipment. Our university rate for 3D-printing services of \$30/kg of PLA plastic was 951 used to calculate the upper bound cost of 3D printed components, whereas the lower bound 952 was calculated as the expense for only the purchase of plastic for those laboratories that 953 already have a 3D printer. A complete camera (Figure 2F) and IR LED (Figure 4G) holder is 954 estimated to require ~130 g of PLA plastic based on our recommended print settings. 955 Commercial Webcam = Logitech C930e Webcam; Industrial camera estimates based on quotes 956 from June 2022 from three widely used behavioral neuroscience suppliers.

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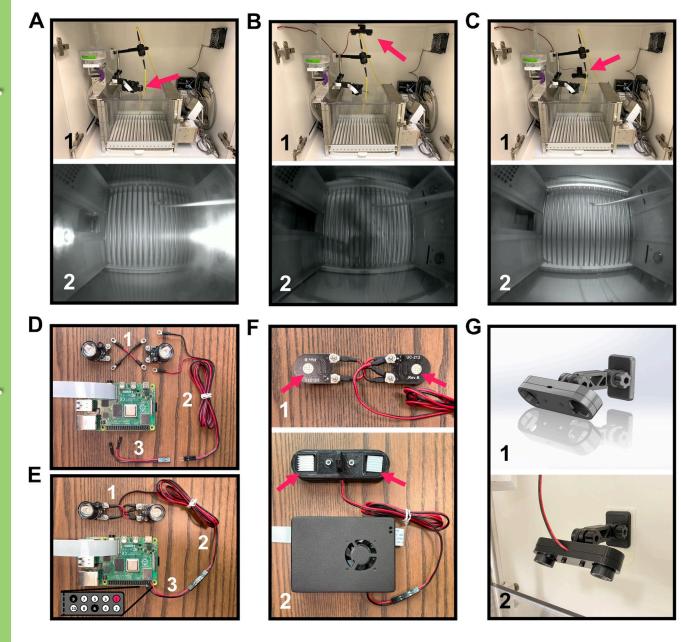


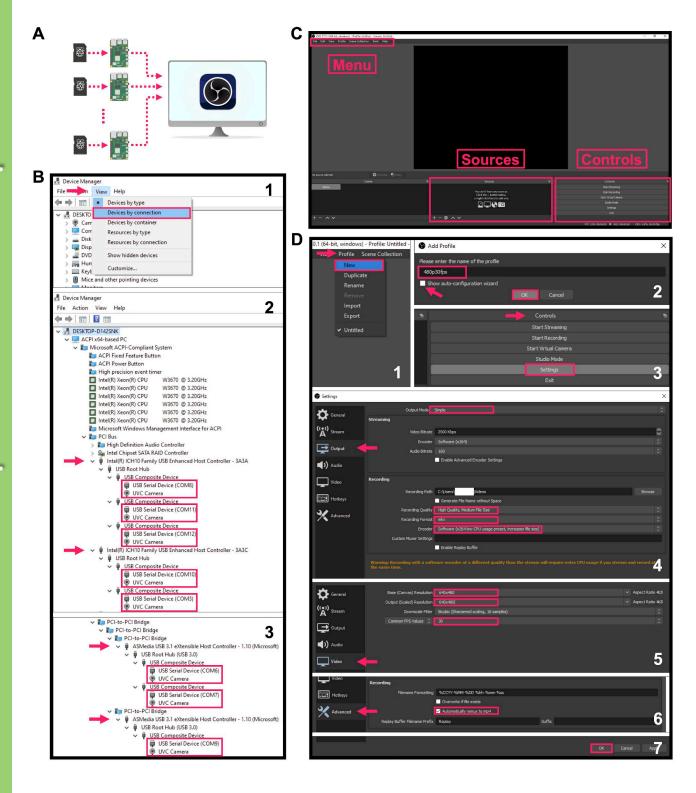
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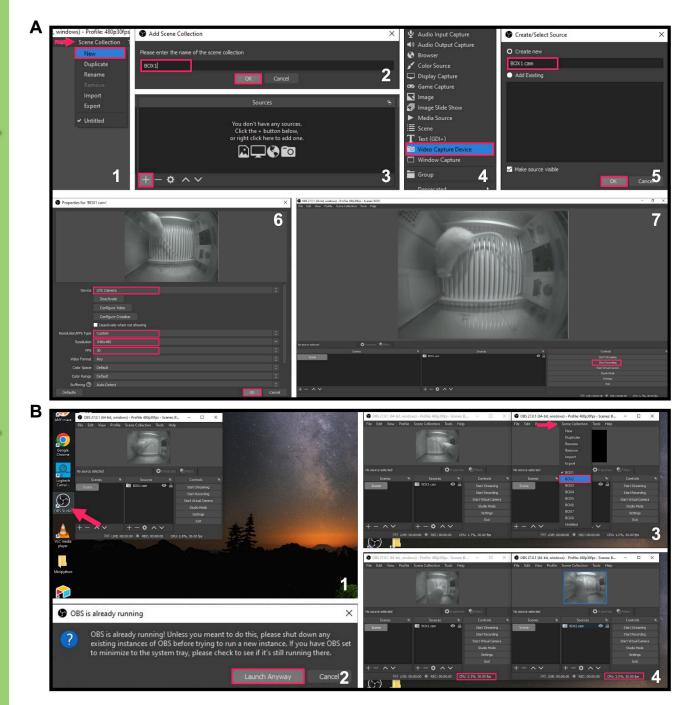


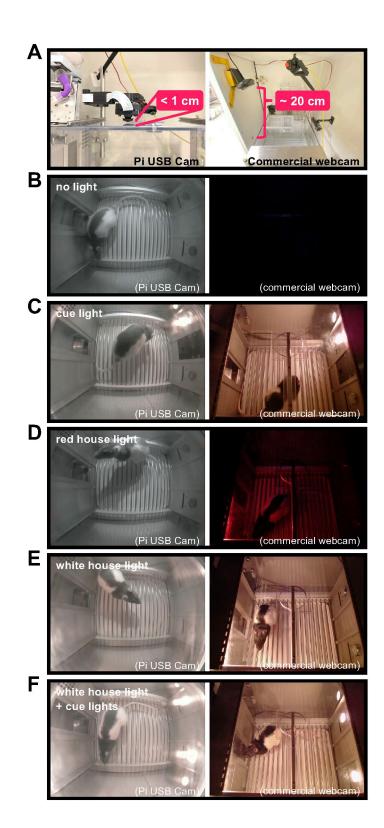


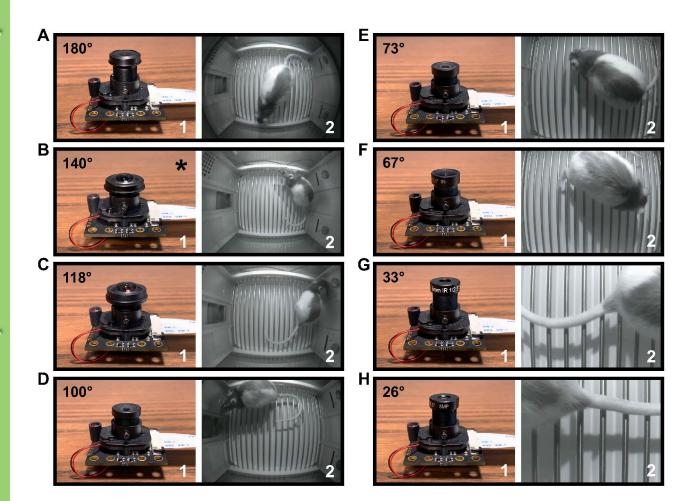
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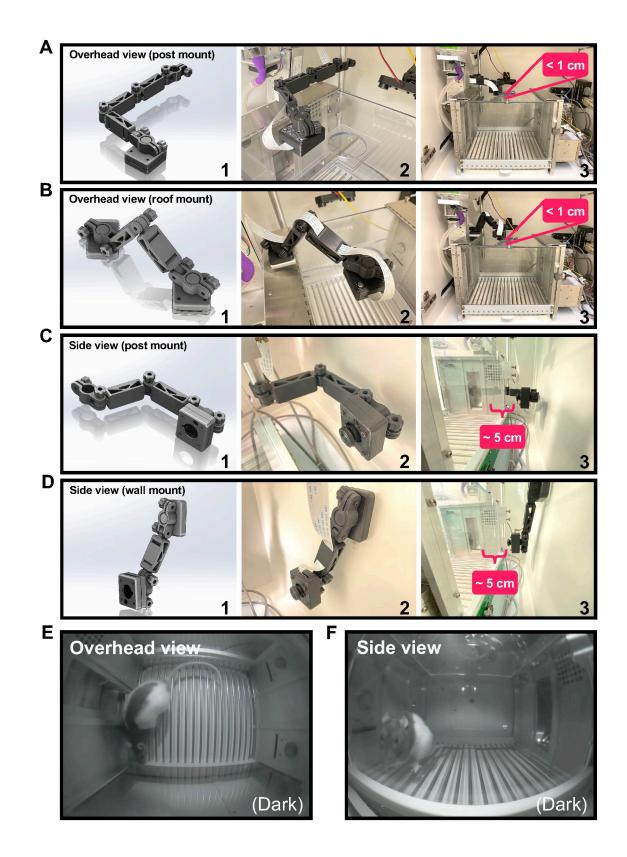




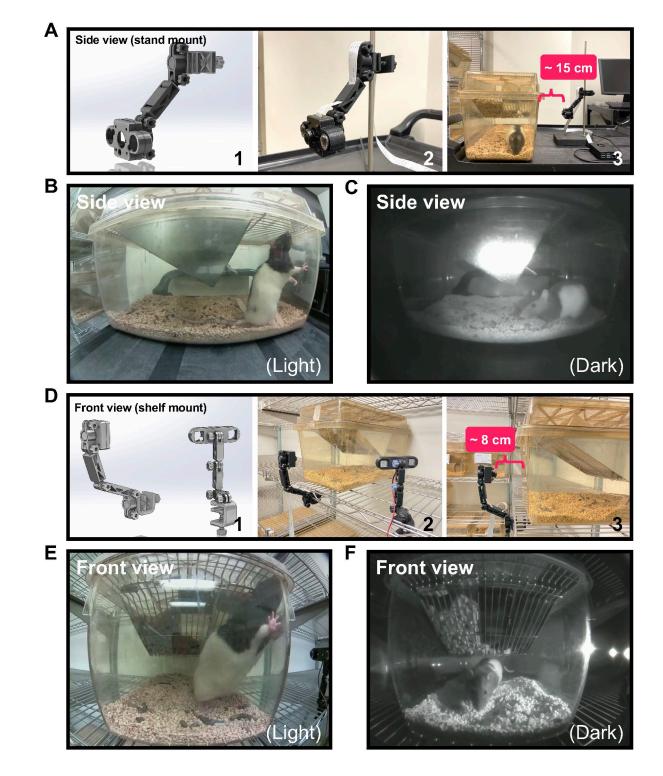


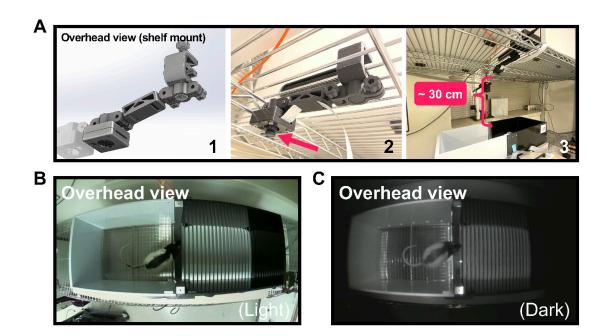


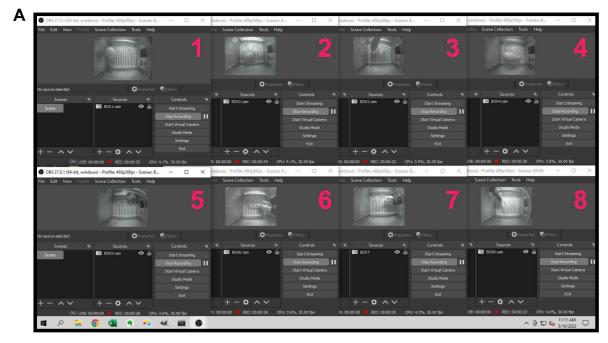








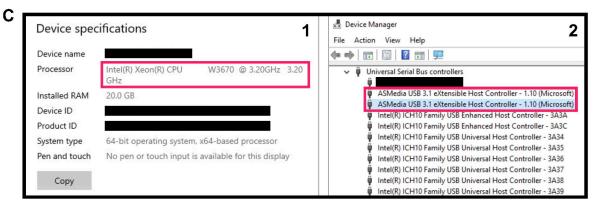




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	3	3

Processes	Performance	App history	Startup	Users	Details	Services					
Name			Statu	IS		~ 44% CPU	15% Memory	2% Disk	0% Network	Power usage	Power usage t
>      OBS Studio (2)				5.8%	67.8 MB	0.2 MB/s	0 Mbps	Moderate	Very low		
> 🕤 OE	OBS Studio (2)			5.4%	69.8 MB	0.8 MB/s	0 Mbps	Moderate	Very low		
> 😗 OE	OBS Studio (2)			5.4%	61.2 MB	0.3 MB/s	0 Mbps	Moderate	Very low		
> 🕤 OE	OBS Studio (2)			5.3%	60.7 MB	0.2 MB/s	0 Mbps	Moderate	Very low		
> 😗 OE	OBS Studio (2)			5.0%	68.1 MB	0.3 MB/s	0 Mbps	Moderate	Very low		
> 😗 OE	OBS Studio (2)			4.8%	62.0 MB	0.2 MB/s	0 Mbps	Low	Very low		
> 😗 OE	OBS Studio (2)			4.5%	61.2 MB	0.5 MB/s	0 Mbps	Low	Very low		
OBS Studio (2)			4.3%	66.4 MB	0.5 MB/s	0 Mbps	Low	Very low			





Product	Vendor	Catalog Number	Price	Comment	
RASPBERRY PI BOARD:					
Raspberry Pi 4 Model B (1/2/4/8GB)	anywhere	n/a	\$35 - 75	Can be purchased as a kit with accessories at a higher cost	
CAMERA MODULE:					
Arducam Wide Angle Day-Night Vision for Raspberry Pi Camera (FOV: 170° [D] x 140° [H])	UCTRONICS https://bit.ly/39PKPH8	B003507	\$32.99		
ACCESSORIES:					
MicroSD Card (16GB)	PiShop.us https://bit.ly/38Nc45c	936 \$7.95		Any microSD card with a minimum storage space of 64MB would work	
Raspberry Pi 4 Compatible Heavy-Duty Aluminum Alloy Case with Pre-installed Ready to Connect Fan	Vilros https://bit.ly/3GnbelQ	VILP015	\$14.99	Any case with camera ribbon cable and GPIO access would work; Metal cases with pre-installed cooling fan would be preferred to prevent overheating of the Raspberry Pi board	
Standard USB to USB-C Cable (6ft)	Vilros https://bit.ly/3alpw0C	VILP103	\$4.99	Any USB-C type cable capable of data transfering	
Jumper Cable Pin Header Connector Housing Assortment Kit	Amazon https://amzn.to/3z3Z0mu	B077X8XV2J	\$12.98	For wiring the IR LED boards to use them independently of the camera board	
Ring Terminal, Non Insulated, 22-16 Wire Size, #4 Stud Size	Amazon https://amzn.to/3LKqUH9	B005GDFMSG	\$11.23	For wiring the IR LED boards to use them independently of the camera board	
Red Black 2 Pin Wires 22 AWG (100ft)	Amazon https://amzn.to/3wJhnvN	B0793N3WZZ	\$18.99	For wiring the IR LED boards to use them independently of the camera board	
Heat Shrink Tubing Kit	Jameco https://bit.ly/3NxH5bX	2095963	\$17.95	For wiring the IR LED boards to use them independently of the camera board	
Crimping Tool Set	Amazon https://amzn.to/38Fy1mR	B0045CUMLQ	\$66.74	For wiring the IR LED boards to use them independently of the camera board	
Wire Stripper	Grainger https://bit.ly/3MOaMps	1XFZ6	\$34.25	For wiring the IR LED boards to use them independently of the camera board	
4-Port USB PCIe Card	CDW https://bit.ly/3aoX6Tz	6409687	\$114.99	For expanding the total USB bandwidth of the host computer during multi-camera recording	

STL file	Picture	STL file
MERA CASE:		IR LED CASE:
_Cam_Case_Top		Pi_LED_Case_Top
_Cam_Case_Bottom_w_Rod		Pi_LED_Case_Bottom_w_Mount
_Cam_w_LED_Case_Top		IR LED MOUNT TOOLS:
_Cam_w_LED_Case_Bottom_w_Rod	a contraction of the second se	Pi_LED_Arm_5CM_M2F
MERA MOUNT TOOLS:		Pi_LED_Base
_Cam_Arm_7CM_M2F	ALL B	Pi_LED_Ring_180D
_Cam_Arm_7CM_M2M_90D	and the	ACCESSORIES:
_Cam_Arm_7CM_M2M_180D	il li	M2.5_Nut_Knob
_Cam_Ring_90D	Contraction of the second	G-Clamp_Clamp
_Cam_Ring_180D	Gie	G-Clamp_Screw
_Cam_Rod_Base		G-Clamp Press

Camera	Lighting condition	Recording length (s)	Video file length (s)	Target FPS	True FPS	Total dropped frames	Dropped frames per min
Commercial	Red house light	300.56 ± 6.08	124.77 ± 2.52	20	8.30 ± 0.00	3515.00 ± 71.25	702.00 ± 0.00
Pi USB cam	Red house light	300.60 ± 6.09	300.54 ± 6.09	20	20.00 ± 0.00	0.00 ± 0.00	$0.00 \pm 0.00$
Commercial	White house light	311.05 ± 4.39	179.57 ± 17.43	20	11.57 ± 1.16	2628.60 ± 377.60	505.60 ± 69.40
Pi USB cam	White house light	311.02 ± 4.41	310.96 ± 4.40	20	20.00 ± 0.00	$0.00 \pm 0.00$	0.00 ± 0.00

Camera	Lighting condition	Recording length (s)	Target FPS	True FPS	Total duplicate frames	Duplicate frames per min
Commercial	Red house light	301.29 ± 3.81	30	8.28 ± 0.01	6545.20 ± 83.92	1303.40 ± 0.24
Pi USB cam	Red house light	301.18 ± 4.09	30	30.00 ± 0.00	$0.00 \pm 0.00$	$0.00 \pm 0.00$
Commercial	White house light	300.37 ± 3.77	30	8.33 ± 0.02	6509.00 ± 79.33	1300.20 ± 1.20
Pi USB cam	White house light	300.65 ± 3.47	30	30.00 ± 0.00	$0.00 \pm 0.00$	$0.00 \pm 0.00$