# <sup>1</sup> BAFFLE: A 3D printable device for macroscopic quantification of <sup>2</sup> fluorescent bacteria in space and time

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#### Abstract

Despite the ubiquity and importance of microbial communities, understanding the population 11 dynamics of mixed cultures in structured environments remains a fundamental problem in microbial 12 ecology. Identifying bacterial strains within a complex microbial community represents a challenging 13 14 technical problem. We describe a low-cost optomechanical device designed to acquire multi-channel time-lapse images of bacterial colonies growing in agar plates. This device uses a system of addressable 15 LEDs and fluorescence filters to estimate the spatio-temporal distribution of different fluorescently-16 tagged cells from time-lapse images obtained using a standard DSLR camera with a macro lens. We 17 demonstrate the potential of this device with a range of applications from experimental microbiology. 18

#### Metadata Overview

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Main design files: https://github.com/ccg-esb-lab/baffle DOI archive: https://doi.org/10.5281/zenodo.6960207 Building instructions: https://www.penamiller.com/lab/baffle Scripts to produce figures: https://github.com/ccg-esb-lab/BAFFLE/tree/master/macros Raw data needed to produce figures: https://github.com/ccg-esb-lab/BAFFLE/tree/master/data Target group: school or academic staff, NGOs and scientific staff. Skills required for building the device: 3D printing – intermediate; mechanical assembly – intermediate; electrical assembly – intermediate; Replication: No builds known to the authors so far.

#### **Keywords**

microbiology; fluorescence imaging; macro photography

#### <sup>19</sup> Introduction

20 An extensive collection of low-cost open-source imaging systems is nowadays available for microscopic

- image capture [38, 28, 29, 42]. These devices are developed following an open philosophy, and therefore
- 22 code and hardware design are openly shared so that a broader range of researchers can build, modify,
- 23 and improve existing projects [9]. However, only a narrow range of such devices is oriented towards

<sup>\*</sup>BAFFLE acronym stands for "Bionic Apparatus For Fluorescent Light Estimation" and it was coined in relation to the first version of the device encased inside a wooden speaker box.

the acquisition of systematic spatio-temporal information within the macroscopic cellular scale between millimeter to centimeter range [12], an arena in which bacterial spatial structure manifests itself and becomes relevant due, for example, to biofilm structure formation during colony growth [19].

In this manuscript, we detail the construction, assembly, and operational guide of a tunable low-cost and 27 open-source programmable imaging system established for in vivo multi-fluorescence macro-photography 28 capture of Petri dish cultures under controlled environmental conditions. As illustrated in Figure 1, 29 the design is modular with a temperature and humidity controlled incubator chamber combined with 30 a customizable mechanical switching 4 fluorescent exciter and filter wheel coupled to a macro-camera 31 with controlled focus through a z-axis step motor. Moreover, the system can capture high quality dark 32 and bright field macro-images using a led flash-lighting system mounted inside the incubator chamber 33 compartment, which can modulate R, G, B, and alpha light parameters and its incidence angle to achieve 34 different light and shadow characteristics helpful in revealing 3D bacterial structure through image stack-35 ing techniques. The device is controlled through a dedicated GUI browser application, which allows 36 the selection of the desired optical, camera, light, temperature and humidity, and time-lapse sequence 37

38 configurations and settings.

<sup>39</sup> We report and demonstrate the usefulness and robustness of the system with a range of applications

40 where a combination of image acquisition and analysis can be used to obtain quantitative data on the

<sup>41</sup> distribution of fluorescently tagged bacteria during surface colonization. We will show that, by estimating

42 the frequency of different strains in time and space, we can estimate fitness of each strain and obtain quan-

43 titative information about the ecological interactions that result from multiple microbial subpopulations

<sup>44</sup> interacting through the environment.



Figure 1: A) Schematic diagram of the device illustrating the fluorescent excitation and emission filters, as well as the bright and dark fields. B) Photograph of device (modules are color-coded: image acquisition and analysis in red, illumination in green, and incubator in pink).

## 45 Overall Implementation and design

 $_{46}$  The device described here was built using Open Hardware components and a standard DSLR camera.

47 We use low-cost electronics to interface with all analog and digital inputs/outputs (e.g. sensors, switches

 $_{48}$   $\,$  and LEDs), as well as to control the Nema-17 stepper motors moving the filter wheel and the vertical

<sup>49</sup> axis. When possible, we used OpenBuilds aluminum extrusion V-slot profiles, with standard screws, nuts

- <sup>50</sup> and joints (a complete list of components can be found in the project's repository [31]). The device also
- <sup>51</sup> contains acrylic elements (cut using a GlowForge laser CNC) and 3D-printed parts (printed in PLA using
- <sup>52</sup> a Ultimaker 3). All files necessary to cut acrylic and print PLA parts are provided as supplementary files.

The system is composed of the following modules: incubation, illumination, fluorescence, and image acquisition. All these modules are managed via a browser GUI (coded in Python-Dash [39]), that allows control and configuration over the set of parameters within each module. In that sense, the overall system can function 'on the fly" in a simple sample inspection mode or, as in the primary mode, as a long-term image acquisition system with a selected set of personalized parameters. The latter can be inserted into

<sup>58</sup> the GUI by the use of a customizable template.

## <sup>59</sup> (2) Quality control

## 60 Safety

The only safety issues relevant to the overall system are the ones regarding the incubator module. The peltier module used for the air heating can reach up to a very high temperature. To maintain the temperature within the standard user-defined values the temperature detector is coupled to a relay system that switches off once the nominal temperature is reached within the incubator. Moreover, the peltier module is inserted into an aluminum heater dissipator and encased within the incubator module which remains isolated to prevent any kind of direct physical contact. As well the 12V-30A power supply that powers most of the system is secluded.

#### 68 Calibration

<sup>69</sup> To calibrate our fluorescent-based approach to identify bacterial genotypes in space, we used a library of <sup>70</sup> *Escherichia coli* K12 bacteria carrying a multicopy plasmid encoding for different fluorescent proteins[4]:

- **Red**: DsRed (excitation 558 nm/emission 584 nm)
- **Red**: E2Crimson (558 nm/583 nm)
- Green: GFPmut3 (500 nm/513 nm)
- Yellow: mVenus (515 nm/527 nm)
- **Cyan**: sCFP-A3 (433 nm/474 nm)
- Non-fluorescent control.

<sup>77</sup> We streaked each strain (see Table 2 for details) into a Petri dish filled with semi-solid LB agar and
<sup>78</sup> incubated overnight. Figure 2A illustrates the acquired images using Bright and Dark fields (white light,
<sup>79</sup> with back and front illumination, respectively). We also acquired images using different filters and LED
<sup>80</sup> configurations (hereafter referred to as *fluorescent channels*): red (excitation 559 nm/emission 630 nm),
<sup>81</sup> green (469 nm/525 nm), cyan (434 nm/479 nm) and yellow (497 nm/535 nm).

Normalized fluorescent intensities for each channel were obtained by subtracting the background and dividing the intensity of each pixel by the maximum fluorescence intensity of the whole image (ImageJ macros used for image analysis can be downloaded from the project's GitHub repository [31]). Figure 2B shows the multi-channel image and Figure 2C the resulting composite image. Note how each strain emits light at a specific wavelength that is detectable by a combination of channels. In the following section we will illustrate how this information can be used to estimate the temporal and spatial distribution of fluorescent strains.

## <sup>89</sup> (3) Application

Although microbial communities have a direct impact in human health [2] and ecosystem sustainability [1], as well as bio-engineering applications [24], understanding the ecological dynamics that emerges between



Figure 2: A) Dark-field image of a Petri dish inoculated with different fluorescent strains of *E. coli* (see Table 2 for a complete list of strains). B) Montage of images acquired using different fluorescent channels: CFP (cyan), GFP (green), YFP (yellow) and RFP (red). C) Overlay image produced by blending different fluorescent channels over the dark-field image.

- <sup>92</sup> different individuals within a complex microbial community remains a challenging problem [13]. Actually,
- <sup>93</sup> it has even been suggested that the key limitation of applying ecological theory to study microorganisms
- <sup>94</sup> is the difficulty of observing microbial communities in ecological settings [34].

A previous study showed that fluorescent microscopy can be used to evaluate the spatial arrangement 95 of different fluorescent strains within the millimeter range [20]. Here we use a similar approach, but 96 using a standard DSLR camera instead of a stereomicroscope, to obtain data on growth and morphology 97 of expanding bacterial colonies from time-lapse images. From these multi-channel images we can then 98 quantify fitness of different fluorescent subpopulations growing in spatially-explicit environments. To 99 illustrate its capabilities, we will describe a series of examples where multi-channel images obtained 100 with our device are used to characterize multiple aspects of the population dynamics resulting from the 101 complex spatial arrangement exhibited during surface colonization. 102

### <sup>103</sup> Use case: Quantifying bacterial fitness from pair-wise competition assays

There are multiple methods to estimate *fitness* of bacterial populations [43]. For instance, many exper-104 imental studies quantify bacterial fitness by growing strains separately and comparing their maximum 105 growth rate, a quantity that can be obtained from the optical density of a well-mixed culture [18]. A clear 106 benefit of this approach is that it can be performed in high-throughput using microwell plate readers, thus 107 obtaining periodic measurements of hundreds of samples while growing under controlled temperature and 108 humidity conditions. However, this approach also has many limitations, as it ignores any growth promo-109 tion or inhibition compounds produced by other strains when grown in co-culture and, more importantly, 110 only measures one component of fitness. 111

An alternative approach to quantify fitness is to grow multiple strains in co-culture and directly measure 112 their relative abundances. This method is based on a pair-wise competition between different strains 113 for limited resources and therefore can be used to determine whether one strain has a fitness advantage 114 over another, thus providing a relative fitness measure instead of absolute fitness. There are, of course, 115 limitations associated with this approach, mainly because we need to be able to identify different cells 116 in a mixed culture. In some cases, specific members of the community can be identified through their 117 morphology in agar plates or by their ability to grow in selective media, although this approach is not 118 always reliable and only works in specific cases. 119

Another possibility is to use fluorescent markers to identify target subpopulations within multi-species microbial communities. Figure 3A shows an experiment that consists of a co-culture of two *E. coli* strains



Figure 3: Diagram illustrating a pair-wise competition experiment. A) A 50-50 culture of fluorescent and non-fluorescent strains is inoculated into rich medium. After growing 24 hours under constant temperature and agitation, a sample is obtained, diluted and spread onto a Petri dish with semi-solid media. B) Images obtained using Bright and GFP channels can be used to obtain binary masks. C) By evaluating the fluorescence of each colony identified in the masks, we estimate the number of colony forming units (CFUs) of each strain. D) Replicating this protocol multiple times allows us to estimate the relative fitness between the fluorescent and non-fluorescent strains.

122 [3], one of the strains was transformed with a well-characterized plasmid containing a gene encoding for a

<sup>123</sup> green fluorescent protein (GFP) [36]. After 24 hours of growth in rich media, the co-culture was diluted

and plated in semi-solid agar with rich media. We incubated the Petri dishes at  $37^{\circ}C$  and estimated the

<sup>125</sup> abundance of each phenotype by counting the colony-forming units (CFUs) of each strain.

Figure 3B illustrates how image processing can be used to analyze multi-channel images (GFP and Bright 126 channels). In particular, here we use image segmentation to obtain binary masks whereby black pixels 127 belong to the background and white pixels correspond to a bacterial colony. By comparing Bright and 128 GFP images, we then determine which colonies correspond to each strain, as illustrated in Figure 3C. 129 Finally, a colony counting algorithm can be used to estimate the proportion of fluorescent colonies with 130 respect to the total number of colonies. This information is very useful, as it enables us to estimate the 131 Malthusian growth ratio between both strains (see Figure 3D), a fundamental quantity in experimental 132 microbiology referred to as *relative fitness* [43]. 133

#### <sup>134</sup> Use case: Evaluating bacterial fitness in a gradient environment

A limitation of the competition assay discussed previously is that it is performed under a single envi-135 ronmental condition. In many circumstances, it is important to simultaneously evaluate the fitness of 136 a bacterial population under a range of environmental conditions. For instance, to determine the crit-137 ical concentration that suppresses the growth of clinically-relevant pathogens, a quantity known as the 138 Minimum Inhibitory Concentration. This can be estimated with parallel competition assays in liquid 139 media or using disk-diffusion assays in agar plates [21]. In the latter approach, bacterial susceptibility is 140 determined by quantifying the zone of inhibition around an antibiotic source. Another benefit of this ap-141 proach is that it allows to characterize the resistance profile of a bacterial isolate to multiple antimicrobial 142 substances in a single Petri dish. 143

A series of laboratory studies have also used spatially-explicit environments to evaluate microbial evolutionary dynamics [5, 8] and to study gene expression in response to environmental gradients [17, 41]. To identify different genotypes from mixed cultures, a common approach is to isolate bacterial clones and <sup>147</sup> perform an analysis of DNA sequences of specific target genes that allow differentiating between different <sup>148</sup> bacterial genotypes[22]. If using fluorescently-tagged strains, then the relative and absolute abundances <sup>149</sup> of different strains can be estimated using spectrophotometry and flow cytometry [33, 25]. Note, however, <sup>150</sup> that both of these approaches are invasive techniques that do not allow for dynamic measurements and <sup>151</sup> long-term observations.

As our device allows us to evaluate the spatial distribution of bacteria with different fluorescent markers, 152 then we can study the consequences of heterogeneous environments on the community dynamics. For 153 example, antibiotic gradients produce a range of selective pressures for (and against) resistant (and 154 susceptible) bacterial genotypes in different spatial locations, so we can use a drug gradient to evaluate 155 the relative fitness between two strains. In a previous study, we designed a bespoke experimental system 156 consisting of a spatially-explicit culture device built using 3D printing [16] whereby cells are immobilized in 157 specific locations, but with antibiotics diffusing between neighboring compartments. Figure 4A illustrates 158 another gradient device built from acrylic, whereby both cells and chemical substances can diffuse through 159 space (SVG files used by the laser engraver can be obtained from the GitHub repository [31]). 160



Figure 4: A) Diagram illustrating an antibiotic gradient experiment consisting in a co-culture of susceptible and resistant bacteria. A 50-50 culture of Cyan (susceptible) and Yellow (resistant) fluorescently-tagged bacteria are inoculated homogeneously in the surface of the agar. B) Multi-channel image acquisition is performed after 48h of incubation, from top to bottom: Dark, YFP, CFP and an overlay image of both fluorescent channels. C) Relative population abundance can be quantified in space based on the normalized fluorescent intensity detected in each channel.

<sup>161</sup> We filled the bottom part of the gradient device with semi-solid agar supplemented with a lethal dose of

- antibiotic  $(50\mu g/ml$  of kanamycin, an aminoglycoside bactericidal drug), and once it has solidified, we
- then pour drug-free LB agar medium on top. After storing for a couple of days at  $4^{\circ}C$ , an antibiotic
- <sup>164</sup> gradient is formed, and we inoculate with a co-culture of *E. coli* bacteria uniformly over the agar surface.
- <sup>165</sup> We denote our strains Gby and Wcl, which are susceptible and resistant to the antibiotic, respectively.
- <sup>166</sup> Both strains encode different fluorescent markers (YFP in Gby, CFP in Wcl) [10, 11], so we estimated the
- <sup>167</sup> spatial distribution of each strain by analyzing multi-channel fluorescent images obtained after 48 hours

<sup>168</sup> of incubation at  $37^{\circ}C$  (see Figure 4B). As expected, a consequence of a drug gradient is the formation <sup>169</sup> of a landscape of selective pressures that modulates the spatial distribution of each strain. Indeed, <sup>170</sup> Figure 4C shows that, at high drug concentrations, the population consists exclusively of drug-resistant <sup>171</sup> cells (yellow), while at low antibiotic concentrations the resistant subpopulation is outcompeted by the <sup>172</sup> susceptible strain, and thus the population consists of drug-sensitive cells (cyan).

### <sup>173</sup> Use case: Evaluating colony expansion within a 3-strain bacterial consortium

To illustrate that multi-channel images acquired with this device can be used to estimate the spatial 174 distribution of different bacterial strains within a multi-species community, we use a previously char-175 acterized resistance-motility microbial consortia[14]. Paenibacillus sp. is a soil bacterium with a social 176 organization based on physical and chemical signaling [7, 35]. Some Paenibacillus sp. (e.g. P. vortex and 177 P. lautus) are known to generate complex spatial patterns consisting of vortices of thousands of cells that 178 serve as building blocks for new colonies [23, 40]. To maintain cohesion of the vortices, flagella of *Paeni*-179 bacillus sp. tend to intertwine with the flagella of neighboring cells [15]. As a result, other organisms are 180 dragged with the rapidly expanding colony. For instance, it has been reported that *P. vortex* is capable 181 of transporting photosynthetic algae when food resources are scarce in order to consume them later, as 182 well as transporting recombinant E. coli with useful properties, such as the expression of  $\beta$ -galactosidases 183 and cellulases that enhance resource uptake from the environment [7, 32]. 184



Figure 5: Multi-channel image illustrating a 3-strain bacterial co-culture in an agar plate containing LB medium (1.5g/l) and a lethal dose of antibiotic  $(50\mu g/ml of ampicillin)$ . A) Dark field image showing a swirling-tree morphology. B) Fluorescent channel overlay image showing the spatial distribution of both *E. coli* strains: resistant in green and susceptible in magenta. C) Plot showing the normalized intensity in concentric rings around the center: dark field in black (*P. lautus*), GFP in green (resistant *E. coli*), and RFP in magenta (susceptible).

<sup>185</sup> In particular, we use a bacterial consortium composed of a non-motile drug-susceptible *E. coli* (magenta),

a non-motile drug-resistant *E. coli* (green), and a motile drug-susceptible *P. lautus* (non-fluorescent). In the presence a  $\beta$ -lactam antibiotic [30], a mutualistic interaction emerges between the resistant *E. coli* and *P. lautus*; the previous produces a  $\beta$ -lactamase that locally degrades the antibiotic, thus allowing

<sup>189</sup> the latter to expand its growing domains. Figure 5A shows that the spatial pattern produced by this

resistance-motility consortium are concentric rings resulting from periods of reduced and accelerated expansion, coinciding respectively with the detoxification of the medium by *E. coli* and the subsequent swarming of *P. lautus*. Figure 5B shows that, during colony expansion, both types of *E. coli* cells (green and red) are dragged short distances, but only the resistant strain can be found in the colony edges, as shown in Figure 5C.

#### <sup>195</sup> Use case: Quantifying spatio-temporal changes in colony morphology

Within the dark field configuration, the system can also be used as a macro and extreme macro photography studio platform with other biological specimens than bacterial colonies, as it allows the performance of image stacking techniques via a micrometric control of the stage position with respect to the camera by the use of an stepper motor and a customized lightning setup.

Figure 6A shows a time-lapse obtained from an experiment consisting on the growth of a bacterial colony of *Paenibacillus dendritiformis* (type T) in an agar plate. This swarming strain is known to develop a diversity of patterns mostly affected by the nutrient level and hardness of the medium [6]. In our experiment, we used a peptone nutrient medium that contained NaCl (5 g/liter), K2HPO4 (5 g/liter), Bacto peptone (1 g/liter), and finally Difco agar was added at a concentration of 1.5% (wt/vol).



Figure 6: Figure illustrating the growth of the pattern-forming bacteria *Paenibacillus dendritiformis*. A) Selected time-lapse frames along its growth showing that the extrusion of the main branches over the inoculum initial contour remains fixed over time, while its tips expand radially and form more branches in a self-similar way. B) Colony expansion quantified as the maximum distance achieved by the colony in time. C) Plot of the evolution of the computed fractal dimension during growth, smoothly converging towards an expected D=1.767 value.

<sup>205</sup> Time-lapse images can also be used to analyze expansion of a growing colony. Figure 6B shows how the

colony radius (here defined as the maximum distance reached by a dendrite to the center of the colony)

<sup>207</sup> increases in time. Moreover, within this low nutrient and hard medium regime, the bacterial colony is

<sup>208</sup> know to produce a self-similar branching morphology through a diffusion-limited process, which can be

- <sup>209</sup> quantified using fractal dimension methods. By using a box counting algorithm, we obtained a fractal
- dimension of the colony patterns of D = 1.767, very close to that of the two-dimensional DLA model and

previous experimental reports around D = 1.73 [27] (see Figure 6C).

### <sup>212</sup> Reuse potential and adaptability

<sup>213</sup> In our device, we used four specific excitation/emission filters and LEDs. To detect different fluorescent <sup>214</sup> proteins, the appropriate filters and LEDs would need to be acquired.

## 215 (4) Build Details

#### <sup>216</sup> Fluorescence excitation

The fluorescent excitation module is build around a commercial design composed of filter cubes, for instance Microscopy Filter Cubes with Pre-Installed Fluorescence Filters by Thorlabs. A collection of Creative Commons fluorescent filter cubes for microscopy can be found in Thingiverse. As illustrated in Figure 7A, each one of the four cubes holds a fluorescence filter set, including an excitation filter (Figure 7C in blue), emission filter (Figure 7C in purple), dichroic mirror (Figure 7B top) and finally an illumination source.

The fluorescent illumination consists in high-intensity Rebel 23mm Quad LEDs with specific wave-lengths: Red (627nm), Amber (590nm), Cyan (505nm) and Blue (470nm). The four fluorescent channels as seen in Figure 7C include excitation filters (mounted in the blue lateral part), and emission filters (mounted in the purple top side): Red (excitation 559 nm/emission 630 nm), Green (469 nm/525 nm), Cyan (434 nm/479 nm) and Yellow (497 nm/535 nm).

As seen in Figure 7B the filter wheel holds all four fluorescence cubes equally spaced together with a hole

(seen in the top red and bottom green acrylic layers) that is used for the dark/bright field illumination.

<sup>230</sup> A Nema17 stepper motor slowly rotates the filter around its central axis, clockwise or counterclockwise

<sup>231</sup> according the time-lapse setup.



Figure 7: Fluorescence wheel module. A) CAD file of the filters cubes which hold on top the emission filter and on the lateral the excitation filter. B) Photography of the dichroic mirror placement in between the two parts of the fluorescent cubes. C) CAD design of the filter wheel system containing the four fluorescent cubes.

#### <sup>232</sup> Image acquisition and analysis

To acquire high-resolution images, we used a standard DSLR camera (Canon T6i) with a macro lens (100mm). Support for the camera is based on a 3D-printed FlexTILT head by Edelkrone (https://edelkrone.com/products/flextilt-head-v3). Camera is controlled from a computer through the open-source software Entangle (https://entangle-photo.org/). We also have a remote control to shoot from our software. Focus is achieved by moving the stage vertically through a linear actuator with a lead screw (for instance, this V-Slot NEMA 17 Linear Actuator Bundle).

Flat field correction may be used when illumination is not even, specially in the case of fluorescent imaging mode, since there may be some dealignment between the fluorescent filter cube and the optical lens of the DSLR camera. Standard flat field corrections can be performed with any post processing image software, such as ImageJ, by taking a background image without the sample and then measuring the mean intensity in order to perform a normalization between images. Moreover, some ImageJ plugins such as https://imagej.net/plugins/bigstitcher/flatfield-correction offer on-the-fly correction for a user-provided dark image and dark image.

 $_{\rm 245}$   $\,$  dark image and/or bright image.

Semi-automated image analysis can be performed using any image processing software. In particular, we
used ImageJ [37] to produce Figures 3-6, with scripts that can be downloaded from the project's GitHub
repository [31].

#### 249 Incubation

In order to maintain temperature in ideal conditions for bacterial growth (usually  $30 \deg C$  or  $37 \deg C$ ), 250 we use an Arduino-based (Arduino Mega2560 + Shield) thermostat build around a system that contains a 251 temperature and humidity sensor (Grove - Temperature and Humidity Sensor (High-Accuracy and Mini) 252 v1.0) and a relay that controls a heat source attached to a series of heat dissipators. Hot air is then 253 introduced into the incubation chamber through 8cm fans. The incubation box is made of 5mm acrylic 254 attached to a V-slot frame through 3D-printed joints. Temperature data from the sensor is continuously 255 read by the GUI, which compares it regularly with the user-selected temperature to active or deactivate 256 the relay connected to the heat source. Similarly, we implemented a humidity control system that actuates 257 an ultrasonic mist maker once the humidity goes below the humidity parameter value selected by the 258 user. 250

#### 260 Illumination

For the dark field illumination setup, we use an 8-segment addressable LED strip with 48 light points 261 in total (6 LED's x 8 segments) directed towards the sample with different incident light angles in a 262 diffused manner via a semi-transparent acrylic sheet. These standard 12 Volt WS2812 low-cost LED 263 fixtures are programmed through FastLED Arduino library (https://fastled.io/). This allows us to define 264 RGB and alpha characteristics of the light in a customizable way for each of the 8 segments according 265 to the user's preferences using serial communication through Python scripting between the GUI and the 266 Arduino controller. For the bright field setup, we use standard white LED non-addressable fixtures which 267 are situated under the semi-transparent acrylic plate that holds the sample. It may be helpful in some 268 situations to incorporate the use of RGB addressable LEDs also within the bright field configuration. The 269 possibility of changing the transmitted light color and its intensity may be useful for instance to have 270 some further flexibility in the balance of the camera aperture and exposure configuration. For that reason 271 it may be easily implemented as an upgrade in future versions of the device, using the same Arduino 272 based configuration as in the dark field mode. 273



Figure 8: A) Photo of incubation/illumination chamber. B) The illumination chamber is composed of eight segments with addressable LEDs that can be controlled independently. C) Structure of the incubation chamber where the heat source and fan are contained. This box also contains the white LEDs used for back illumination (bright field).

### <sup>274</sup> Operating software

275 We developed a Python-based GUI using DASH components (https://dash.plotly.com/dash-core-

components), allowing us to control the device through a standard web browser. This software allows
to separately control color and intensity of each segment in the dark light module, as well as of the
fluorescent LEDs and the position of the filter wheel.

<sup>278</sup> fluorescent LEDs and the position of the filter wheel.

<sup>279</sup> To trigger the camera shutter we use a standard remote control shutter release cable. So, by setting the

camera to Bulb, we then control each individual optical configuration speed by setting the exposure time

<sup>281</sup> into the slider position.

This system allow us to work with multiple independent optical configurations within the same time-lapse
 experiment. For instance, one can define a setup composed of 5 instances:

- Bright Field (1 sec exposure)
- Dark Field (white #f0f8ff color, 0.01 sec exposure)
- Dark Field (yellow #fdff00 color, 0.5 sec exposure)
- Cyan Fluorescence (5 sec exposure)
- Red Fluorescence (20 sec exposure)

This instances are going to be performed sequentially each time interval defined within the time-lapse box timer and with the temperature and humidity set at the subsequent sliders. In order to interface the digital camera to the computer we use the mentioned open-source software Entangle, which provides live image preview and a graphical interface for tethered shooting.

Moreover, some of the most relevant internal processes performed during the duration of the experiment, such as temperature and humidity readouts and motor movements, are printed into the terminal log in order to maintain a time-stamp register of all the actions. Finally, the device runs an Ubuntu 20.04.3 LTS Linux 64 bits OS with an Intel Core i7-11700 @ 2.50GHz x 16 processor, 62GiB of memory and 2TB of disk capacity.

## 298 Dependencies

In order to 3D print the designs a slicing software such as Ultimaker Cura2 is required to convert the provided .stl files into g-code. All .stl files for 3D printing were created through parametric modeling and

<sup>301</sup> can be modified using OpenScad [26].



Figure 9: Screenshot of the graphical browser user interface that provides an interactive method to control the device settings and preferences. The green arrows point to the illumination controls, red arrows to the camera and in pink arrows to the incubator module.

The GUI was written in Python and depends on various common libraries (pandas, numpy, time). We use a Plotly-based framework to display the web app (Dash and Dash Core Components; https://github.com/plotly/dash). Phidget22 is used to control the stepper motors (https://pypi.org/project/Phidget22/). FastLED is used to control the addressable LED strip (https://github.com/FastLED/FastLED).

## <sup>307</sup> Hardware documentation and files location

- 308 Name: GitHub
- <sup>309</sup> Persistent identifier: https://github.com/ccg-esb-lab/BAFFLE/
- 310 Licence: MIT License
- 311 Publisher: Rafael Peña-Miller
- $_{312}$  Date published: 28/02/2022

## $_{_{313}}$ (5) Discussion

The use of dark/bright field and fluorescent macroscopic imaging techniques in controlled environments and within the millimeter range constitutes an essential tool in order to develop studies focused on bacterial colony growth and biofilm formation in spatially explicit environments. Yet, hardware and software instrumentation within microbiology research domains is often expensive and restricted, leading to a <sup>318</sup> narrow use outside wealthy research institutions and academic labs. On the other hand, the increasing
<sup>319</sup> availability of open source microcontrollers and customizable manufacturing technologies has facilitated
<sup>320</sup> the development of inexpensive scientific devices and laboratory equipment both inside and outside tra<sup>321</sup> ditional microbiology lab environments, such as in high schools, DIY-DIWO movements (Do It Yourself,
<sup>322</sup> Do It With Others), amateur microscopy groups, maker spaces and biofablabs, and within ecology and
<sup>323</sup> bioart collectives.

By following this open hardware and open source software ethos, we have developed an image acquisition device with the aim of acquiring time-lapse macro images of Petri dishes by the use of an inexpensive, reliable and tunable system. In that sense our system can be used to function both in a single-channel or multi-channel configuration, and both in a dark field or multi-fluorescence light arrangement. Moreover, in order to allow for controlled growth conditions that permit to obtain reproducible observations in long term duration experiments, the system allows to set-up different environmental configurations that can also be variable in time.

In order to test our imaging system overall functionalities, we have investigated its scope and limitations on several experimental cases that had the need of spatio-temporal tracking and quantification of both nonfluorescence and multiple fluorescence signals. Besides those explored trials we think that the modularity of our systems may allow to perform other type of non bacterial growth experiments such as the tracking of plasmodium filaments in amoebozoa organisms, the formation of mycelium fungal networks or even root system architectures in plants.

A last thought, regarding the overall building experience of such a device, goes into acknowledging its 337 entangled multi-disciplinary technical aspects and human expertise sides. By gathering a collaborative 338 group effort made of individual know-how insights, ranging from DIY building designs to synthetic biology 339 plasmid transformation techniques, what finally emerges is represented, as greater than the sum of the 340 parts, not as the device itself but rather as an horizontal transfer of knowledge's along a shared path. 341 Being so, this kind of projects can be framed not only as empowering observational tools to be used by 342 underrepresented (academic and non-academic) collectives but also as experimental educational practices 343 shaped within the community. 344

## 345 Future Work

One of the difficulties encountered while using the humidity control of the incubator via the mist maker is the formation of water condensation droplets upon the transparent acrylic cover resulting in blurred images. In order to prevent this issue, we are currently working in the use of an anti-fog coating sheet layer that removes the fog once a small current is applied to it.

The aperture control system of the DSLR camera that we use it is not allowed to vary along each timelapse optical configuration. This turns out to be not optimal when working for instance with combined dark/bright field and fluorescent modes, since the former requires a small aperture in order to improve the depth of field of the image and the latter requires a big aperture in order the capture the fluorescent light which is fainter.

Last but not least, we find important to mention that even we tagged the device as being "low-cost" by comparing it to similar commercial versions, the use of a DSLR camera and it's optics together with an state-of-the-art computer makes the overall system out of the budget for a wide proportion of users. For all that, all the software can in fact run into tiny and affordable computers, such as Raspberry Pi models, and its corresponding Raspberry Pi High Quality Cameras, which ultimately turns out to drop the general price of the device.

## <sup>361</sup> Paper author contributions

CTP and RPM designed and assembled this device. CTP, DRG, FS, AFD and RPM performed experiments and analysed the data. RPM and AFH assembled and tested earlier versions of this device. All <sup>364</sup> authors contributed to discussions and writing of the manuscript.

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## 374 Competing interests

<sup>375</sup> The authors declare that they have no competing interests.

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# 486 Supplementary Figures



Figure 10: Electronic schematic diagram of the fluorescence and bright field illumination modules. Stepper control is achieved with a Phidgets Stepper Bipolar HC. Analog and digital inputs/outputs are controlled through a Phidgets Interface Kit.

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Figure 11: Electronic schematics of the humidity and temperature sensors, and dark field illumination module.

Strain	Phenotype	Fluorescence	Experiment	Source
Escherichia coli BW25113	Wild-Type	No	Calibration	[3]
E. coli MG1655-Crimson	Plasmid encoding E2Crimson protein	Red	Calibration	[4]
$E. \ coli \ MG1655-DsRed$	Plasmid encoding DsRed protein	Red	Calibration	[4]
E. coli MG1655-GFPmut3	Plasmid encoding GFPmut3 protein	Green	Calibration	[4]
E. coli MG1655-mVenus	Plasmid encoding mVenus protein	Yellow	Calibration	[4]
E. coli MG1655-Cyan	Plasmid encoding sCFPA3 protein	Cyan	Calibration	[4]
E. coli tyrA-	Tyrosine auxotrophy	No	Colony counts	[3]
E. coli tyrA-pBGT-1	Tyrosine auxotrophy	Green	Colony counts	[3, 36]
	encoding TEM-1 $\beta\text{-lactamase}$			
$E. \ coli \ Gby$	Kanamycin resistance & YFP protein	Yellow	Gradient	[10, 11]
$E. \ coli$ Wcl	Kanamycin susceptible & CFP protein	Cyan	Gradient	[10, 11]
E. coli-mCherry	MG1655 and mCherry protein	Red	Expansion	This study
$E. \ coli \ pBGT-1$	Mg1655 with pBGT-1 plasmid	Green	Expansion	[36]
Paenibacillus lautus	Pattern forming	No	Expansion	F. Federici
Paenibacillus dendritiformis	T morphotype 30A1	No	Morphology	Bacillus Stock
				Center (OSU)

Table 2: Strains used in the experiments presented in this study.