NTDscope: A multi-contrast portable microscope for disease diagnosis

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Abstract

Accurate diagnostics are essential for disease control and elimination efforts. However, access to diagnostics for neglected tropical diseases (NTDs) is hindered by limited

> healthcare infrastructure in many NTD-endemic regions, as well as by reliance on timeand labor-intensive diagnostic methods, such as smear microscopy. New diagnostic tools that are portable, rapid, low-cost, and meet World Health Organization (WHO) sensitivity and specificity targets are urgently needed to accelerate NTD control and elimination programs. Here, we introduce the NTDscope, a portable microscopy platform that enables point-of-care imaging and automated detection of parasites and other pathogens in patient samples. The NTDscope builds on and extends the capabilities of the LoaScope, a device that turned the camera of a mobile phone into a microscope and used on-board image processing to automatically quantify Loa loa microfilariae burden in whole blood samples. The NTDscope replaces the mobile phone of the LoaScope with a system-on-module (SOM) that enables the integration of multiple imaging modalities in a single package designed to improve robustness and expand applications. In this work, we demonstrate use of the NTDscope as a portable brightfield, darkfield, and fluorescence microscope for samples including microfilariae and helminth eggs. We also show that the device can be used to quantify molecular assays, such as a lateral flow test and a CRISPR-Cas13a-based assay. The ability to combine diagnostic capabilities of conventional microscopy with molecular assays and machine learning in a single device could expand access to diagnostics for populations in NTD-endemic areas and beyond.

Author summary

Neglected tropical diseases (NTDs) impact one billion of the world's most vulnerable individuals. Diagnostics are a necessary part of NTD disease control and elimination efforts, but identifying infected individuals remains a challenge. Here we present the NTDscope, a portable multi-contrast microscope designed to diagnose multiple NTDs at the point-of-care. We show that the NTDscope can be used to detect the parasitic worm *Loa loa* in videos of whole blood samples and parasitic eggs in images of urine and stool samples. The NTDscope can also be used to image thick blood smears in disposable capillaries and serves as a lateral flow assay reader. In addition to brightfield and darkfield imaging, fluorescence imaging on the device enables molecular assays based on CRISPR-Cas enzymes. This portable (<1 kg), field-friendly device—tested in Cameroon, Gabon, Côte d'Ivoire, and Bangladesh—has the potential to become a platform technology that addresses diagnostic needs for multiple NTDs and could serve as a key element of decentralized healthcare in the future.

Introduction

Despite ongoing disease control and elimination efforts, neglected tropical diseases (NTDs) impact over one billion of the world's most vulnerable individuals. For some NTDs, identification of individuals in need of treatment or verification of mass drug administration efficacy remains a major challenge [1–3]. Limited healthcare infrastructure in some NTD-endemic regions means that diagnostics must be brought to individuals, rather than individuals going to local clinics for testing. In the absence of point-of-care diagnostics, samples must be transported to a centralized facility for preparation and analysis, introducing long delays and challenges returning test results to specific individuals. While lateral flow assays and other molecular tests have simplified identification of some diseases, point-of-care molecular tests for NTDs including schistosomiasis, soil-transmitted helminths, and filarial infections are in limited use or still in development [4–12].

As a result, diagnosis of many NTDs continues to rely on conventional methods,

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> such as thick smear microscopy for filarial parasites like *Loa loa* and urine microscopy for *Schistosoma haematobium* eggs. New approaches that are faster, cheaper, and more accurate than conventional microscopy are urgently needed to accelerate NTD control and elimination programs, with an emphasis on diagnostics that can enable rapid point-of-care testing of individuals, support starting and stopping decisions for mass drug administration (MDA) campaigns, and monitor re-emergence and spread of infections [1–3, 13–17].

Diagnostic strategies that can detect multiple NTDs are particularly compelling, given the limited resources in many NTD-endemic regions [14, 17, 18] and the need to keep costs per test as low as possible. It may be more cost-effective to have a single device diagnose multiple diseases than to develop separate assays using separate equipment. For example, automated slide-scanning microscopes that can image different types of prepared patient samples (e.g. blood, urine, or stool) have recently been developed [19–24], offering versatility in pathological diagnostics. However, these devices are often bulky, sometimes requiring the use of a separate computer, and are constrained by sample preparation methods that are typically slow and labor intensive, such as fixing and staining a blood smear. They also require technical expertise to run and interpret data, though machine learning algorithms are being developed to automate interpretation [19–21, 23, 25–34].

We previously developed a point-of-care diagnostic device called the LoaScope to identify patients who should not be treated during onchocerciasis MDA campaigns to avoid the potential for serious adverse events that are known to occur at high *Loa loa* microfilarial loads [35]. The LoaScope was designed to be a portable, field-friendly microscope that involved minimal sample preparation and provided rapid (<5 min) point-of-care quantification of microfilaria in peripheral whole blood [36]. The device was successfully used to quantify *Loa loa* microfilarial load of >16,000 people in Cameroon as part of a Test-and-Not-Treat program to resume ivermectin MDA for onchocerciasis in Loa-endemic regions [37]. The LoaScope harnessed the camera of a mobile phone and a reversed lens optical system [38], together with 3D-printed components and consumer electronics for illumination and sample translation. Sample preparation and imaging were simplified by loading patient peripheral blood into a disposable capillary with a rectangular cross-section that could be directly inserted into the LoaScope for imaging [36].

Since the LoaScope has sufficient resolution to capture images of parasite eggs, we tested whether the device could be used for detection of *Schistosoma haematobium* eggs in urine samples. We developed a tapered version of the capillary that captures particles greater than 20µm and used it to filter and concentrate *S. haematobium* eggs from patient samples [32]. We used a new version of the LoaScope with darkfield illumination capabilities, called the SchistoScope, to image the concentrated eggs in Ghana and Côte d'Ivoire [32, 39, 40]. Darkfield images proved to be useful for identification of eggs, demonstrating that the LoaScope could expand its applications to other NTDs [34].

Here, we present the next generation of the LoaScope, renamed the NTDscope for its 56 additional capabilities that expand the set of potential diagnostic applications. The 57 NTDscope provides multi-contrast portable imaging for both microscopy applications 58 and molecular assay detection. Rather than using a phone itself, the NTDscope uses 59 specific mobile phone components, such as camera modules, a rechargeable battery, and 60 sensors, allowing the parts to be configured into an integrated and portable platform. 61 As in the LoaScope, the new device takes advantage of a low-cost reversed lens optical 62 system with a wide field of view (FOV) [38] and uses single-axis motion for acquisition 63 of multiple images and videos of samples in capillaries. User-facing software is based on 64 Android, and cloud connectivity enables data upload and remote software updates. 65 Upgraded computing capabilities of the NTDscope support the use of machine learning 66

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(ML) algorithms for automated disease identification.

Below, we outline the technical specifications of the NTDscope and demonstrate both current and future use cases, including video capture of live microfilarial and *Schistosoma* samples, multi-contrast imaging of parasitic eggs, imaging of stained samples, and detection of molecular assays. The NTDscope has the potential to become a platform technology that addresses image-based and molecular diagnostic needs for multiple NTDs and serves as a key element of decentralized healthcare in the future.

Materials and methods

Ethics statement

This work contains images and videos of patient samples from four separate studies conducted in Cameroon, Gabon, Côte d'Ivoire, and Bangladesh.

The study in Cameroon was conducted in the Awae Health District, located in the Mefouet-Afamba Division, between September and October of 2023. Finger prick blood was collected from study participants. Ethical permission for this study was granted by the Centre Regional Ethical Committee for Research on Human Health (CRERSH-Ce; CE N°0094/CRERSHC/2023) and administrative authorization was obtained from the Centre Regional Delegation for Public Health of the Ministry of Public Health. The study participants signed informed consents.

The study in Gabon was conducted in the Sindara and Lambaréné regions in August of 2023. Finger prick blood was collected from study participants. Ethical permission for this study was granted by the Comité d'ethique Institutionnel du CERMEL (CEI-026/2022). Adults 18 years or older were invited to participate and provided a written informed consent.

The study in Côte d'Ivoire was conducted around the town of Azaguié in January of 2024. Ethical permission was granted by the University Health Network, Toronto, Canada (REB #21-5582) and the Comité National d'Éthique des Sciences de la Vie et de la Santé, Abidjan, Côte d'Ivoire (REB #186-21/MSHPCMU/CNESVS-km). Ethical permission was also granted by the local health district officer. Community members aged five and older were asked to provide a urine sample. Adults provided written consent and assenting children who had written consent from a parent or guardian were included.

The study in Bangladesh was conducted from October 2019 - December 2020 in the 98 Rohingya Refugees camp in Bangladesh. Ethical permission for this study was granted 99 by the International Centre for Diarrhoeal Disease Research, Bangladesh (icddr,b) 100 Institutional Review Board (research protocol #PR-19014). Children who were 101 residents of the camp and seeking care from icddr, b-operated Diarrhoea Treatment 102 Centre were asked to participate by providing stool samples. Children were included if 103 they assented and had written consent from a parent or guardian. Banked stool samples 104 were used for the purposes of this paper; participants and their guardians were informed 105 that unused samples would be stored for future use, and at any time participants and 106 their guardians could contact the study team if they wished for the samples to be 107 discarded and not saved. 108

External Dimensions

The NTDScope has dimensions of 200mm (H) x 110mm (W) x 60mm (D) and weighs ~880 grams. A diagram of the device and its main components is found in Fig 1. The injection-molded top housing holds a rechargeable Lithium-ion 3.7V battery and an LCD screen display. The bottom housing is composed of two pieces: a structural carriage and

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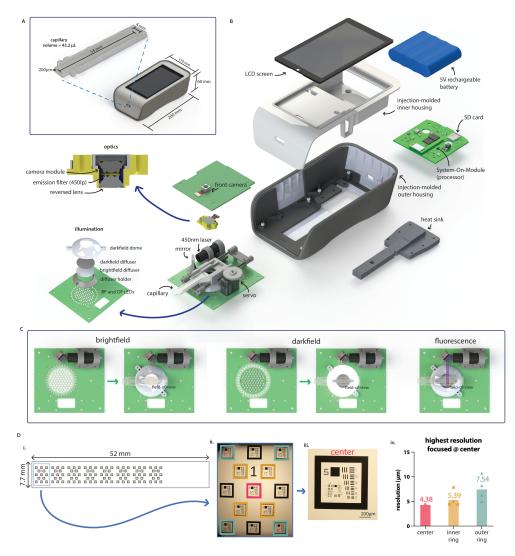


Fig 1. NTDscope design, illumination and resolution A: Diagram showing NTDscope and straight channel capillary external dimensions. B: Exploded view of NTDscope and main components. C: NTDscope illumination modes, showing brightfield, darkfield and fluorescence illumination. D: NTDscope resolution measurements, showing design of custom slide with USAF resolution targets (D.i.), image of USAF resolution target array acquired on NTDscope used to measure resolution, with the resolution targets used in calculations color coded with pink (center), yellow (inner ring) and green (outer ring) (D.ii.), close up of center resolution target (D.iii.), and resolution measurements at each target location (D.iv.). Data was processed and visualized using GraphPad Prism 10.

an outer protective housing with an over-molded elastomeric shell. The bottom housing holds the electrical boards, optical system, and a heat sink for the System-On-Module (SOM) and illumination board. Charging of the battery is done via USB-C, and battery life in field settings in Cameroon and Gabon has been observed to be around 6 hours.

Electronics and Processor

Instead of a mobile phone, the NTDscope uses a series of three electronics boards containing connections to power, processors, sensors, and actuators. It is based around a System-On-Module (SOM)(Open-Q 660µSOM, Intrinsyc) that features a Qualcomm

> SDM660 processor. The main control carrier board (CCB) connects the battery, LCD screen, SD card for storage (256GB), and the SOM board. The illumination board has connections for the brightfield and darkfield LEDs and laser for fluorescence detection, as well as to a servomotor used to move the capillary carriage. Certain hardware components, including the carriage translation system, the fluorescence illumination components, and the servomotor, are also attached to the illumination board. Finally, the camera board contains connections for the sample and front cameras.

Imaging System

The system uses a SONY IMX586 sensor, with a 6.4mm x 4.8mm active area comprised 130 of 48 megapixels of 0.8µm pitch, arranged in a quad-Bayer array which thus has an 131 effective pixel pitch of 3.2µm for the red and blue pixels and 2.3µm for the (45° rotated 132 compared to red and blue) green pixel array [41]. The optical train is a reversed-lens 133 configuration using Largan Precision lenses and provides a measured on-axis resolution 134 of $\leq 4.4 \mu m$ (Fig 1D) with a (measured) magnification of M=1.00. The optical image 135 area exceeds the sensor dimensions, resulting in a sensor-limited field of view. The 136 system also includes an external front camera, with a SONY IMX214 sensor (13 137 megapixels and $1.12\mu m$ effective pixel size [42]), which is not a part of the reversed lens 138 system but can be used to scan patient barcodes during diagnostic field studies. 139

Optical Resolution

The NTDscope optical system consists of a reversed-lens system [38] with lenses of 141 f-number f/1.8 and a camera sensor with a quad-Bayer array as described above [41, 43]. 142 The green pixels in the array have a peak transmission of \sim 525nm, and for that 143 wavelength theoretical on-axis optical resolution is, per the Rayleigh formula, $\delta r \simeq 1.2 \mu m$. 144 Actual obtained resolution is limited by undersampling of the image by the sensor pixel 145 array; typical mobile-phone cameras are designed to have significant modulation 146 transfer function (MTF) at Nyquist (i.e., undersampling) to increase field of view at the 147 expense of aliasing. In the case of the NTDscope, for an f/1.8 undersampling is >4.8X 148 in the green, based on the 2.3µm pitch (for green pixels) and the magnification, 149 wavelength, and f-number based Nyquist sampling pitch requirement. This leads to a 150 rough expected (aliasing-limited) on-axis resolution of $\delta r \sim 5.5 \,\mathrm{um}$, consistent with 151 measurements using a custom glass resolution target the size of a capillary, containing 152 numerous arrangements of the 1951 USAF target (Opto-Line International), which yield 153 consistent on-axis resolution better than $4.4 \mu m$ (228 lp/mm, the limit of the resolution 154 target, Fig 1D). The slightly better-than-expected on-axis resolution is attributable to 155 the uncertainty in estimating sampling-limited resolution as well as the image processing 156 done in the camera firmware based on the additional true 0.8µm pitch of the pixels in 157 the quad-Bayer arrangement. Optical resolution at the extreme edge of the field of view 158 (at 4mm radius) is expected to degrade by a factor of about $\gtrsim 1.6$ (to $\delta r \sim 1.8 \mu m$ along 159 the radial direction) due to NA-limiting from pupil obliquity and increased image 160 distance based on the $\sim 37^{\circ}$ maximum field angle. USAF-target data for extreme field 161 radii are consistent with this, limited again to $>4.4\mu m$ (optically, by expected aliasing 162 issues as discussed, and, in terms of measurement, by the available feature sizes of the 163 test target.) Focus gradients due to imperfect stage alignment in these (small-batch 164 produced, and thus larger-toleranced) devices resulted in worst-case resolution of $\sim 10 \mu m$ 165 at the extrema of the FOV (measurements taken at an average 2.7mm from the FOV 166 center, (Fig 1E.iv.), which remains more than sufficient for use with $\sim 100 \mu m$ or greater 167 sized filarial worms as well as for *Schistosoma* and soil-transmitted helminth eggs. 168

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Brightfield and Darkfield Illumination

The system is illuminated by an inner ring consisting of 74 LEDs and an outer ring of 170 35 LEDs. Illumination of the inner ring is used to produce brightfield imaging, while 171 illumination of the outer ring allows for darkfield capabilities, as shown in Fig 1C. 172 Directly above the illumination LEDs, a diffuser holder hosts a brightfield diffuser, 173 creating uniform illumination across the field of view, and a black, darkfield diffuser, 174 which is used to prevent reflections during darkfield illumination while allowing 175 transmission of brightfield LED illumination. A dome-shaped plastic part, the darkfield 176 dome, surrounds the illumination LEDs and directs light from the outer LED ring 177 towards the edges of the field of view during darkfield illumination. 178

Fluorescence Illumination and Emission

Fluorescence illumination uses a laser (405 nm, 50 mW), a mirror, and a set of 180 interference filters suitable for fluorophores such as Alexa Fluor 405, Alexa Fluor 430. 181 ATTO 390, ATTO 425, ATTO 465, etc. The laser is positioned parallel to the 182 NTDscope sample holder, such that the beam hits a mirror oriented at 45° to direct the 183 beam towards the edge of the sample. The excitation filter (CT405/10x, Chroma184 Technology Corp) is attached directly to the laser. The emission filter (CT450lp, 185 Chroma Technology Corp) is positioned between the reversed lens and the camera 186 module on the collection optics. A diagram showing fluorescence illumination is shown 187 in Fig 1C. 188

Sample Capillary and Translation

The NTDscope sample carriage accepts capillaries or other samples with outer 190 dimensions 12mm x 59mm x 1mm, compatible with the original LoaScope capillaries. 191 The carriage moves in one dimension and is able to capture seven distinct FOVs. The 192 original capillary, developed for imaging *Loa loa* microfilariae (mf) in peripheral blood, 193 has a channel with dimensions of 54mm x 4mm x 200µm (Fig 1A), holding a total blood 194 volume of 43.2μ L. Each of the seven distinct FOVs that can be imaged covers a volume 195 of 4.96μ L of blood, for a total of 39μ L per capillary. In addition to the rectangular 196 capillary, we iterated on the design to create capillaries for other use cases, conserving 197 external dimensions to retain compatibility with the NTDscope carriage. For example, a 198 tapered capillary for processing urine and stool samples, shown in Fig 3, and a thick 199 smear capillary, shown in Fig 4. 200

Software

The NTDScope runs on Android 9 operating system (OS). Given the operating system, 202 machine learning (ML) algorithms tailored to specific neglected tropical diseases can be 203 loaded onto the device for automatic pathogen detection [44, 45]. We developed custom 204 Android applications (apps) for the NTDscope, enabling control of the sample location, 205 focus, capture of images and videos, etc. The location of the sample is controlled via 206 software by rotating a servomotor gear attached to the capillary carriage. Focus is 207 controlled by vertical translation of the camera lens module. Brightfield and darkfield 208 illumination are controlled via software by turning on the central (brightfield) or outer 209 ring (darkfield) LEDs. Flourescence illumination is achieved by activating the laser. A 210 custom app was developed for the quantification of *Loa loa* burden, and was tested in 211 rural field settings in Cameroon and Gabon. This app allows the user to capture patient 212 information (with an option to read patient-associated barcodes), and insert a 213 blood-filled capillary, after which it automatically captures five-second videos in seven 214

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different locations along the capillary, translating it before each new acquisition. After imaging, the sample videos are processed and the *Loa loa* burden is quantified and reported.

Results

Quantification of live microfilariae in blood samples

The NTDscope can be used to capture videos of moving samples, such as microfilariae (mf) of *Loa loa* and other filarial parasites. The videos can be processed to detect live parasites without the need for staining or additional sample preparation, allowing for point-of-care diagnosis and quick time-to-result. We demonstrate this by using the original rectangular capillaries to acquire videos of microfilariae in blood and plasma, as shown in Fig 2.

We used samples of patients infected with Loa loa and Mansonella perstans, as 226 validated by calibrated thick blood smears, acquired in Cameroon and Gabon. To fill 227 the capillaries, a patient fingertip was pricked with a lancet and peripheral blood was 228 wicked into the capillaries via capillary action (as described in [36]). The blood-filled 229 capillaries were then inserted into the NTDscope, and five-second videos of seven 230 distinct FOVs of each sample were captured, with the capillary automatically translated 231 by the servomotor between each imaged FOV. Videos are automatically analyzed for mf 232 detection using software loaded on the device. The total imaging and processing time 233 for diagnosis is less than 3 minutes. Fig 2B shows a picture of one capillary filled with 234 blood from a Loa loa-positive patient in Cameroon, followed below by screenshots of the 235 7 videos acquired (blood images), and showing the capillary regions that the FOVs 236 correspond to. A video of one of these FOVs is shown in Supplementary Video 1. 237

Patient sample videos were processed by an algorithm that subtracts subsequent 238 frames to generate difference images (as described in [36]). Difference images show 239 regions of high intensity in locations of the FOV where there was movement, in this case 240 due to the presence of microfilariae in the sample. The bottom row of Fig 2B shows the 241 difference images generated from the videos of the patient sample, which had calibrated 242 thick smear counts of 4001 mf/ml. The higher number of high intensity regions in 243 difference images corresponds to higher *Loa loa* mf concentration in patient samples. 244 This is demonstrated in Fig 2C, where the difference image corresponding to one FOV 245 of four different patients is shown. The corresponding thick smear counts for those 246 patients (ranging from 0-1047 mf/ml) are shown below each image. 247

We also used blood and plasma samples of cats infected with live Brugia malayi 248 microfilariae (provided by the Filariasis Research Reagent Resource Center for 249 distribution through BEI Resources, NIAID, NIH). For these samples, blood and plasma 250 were pipetted directly into the NTDscope capillaries. To capture videos of plasma, the 251 cat blood was left to separate into its components overnight, after which $43.2 \ \mu L$ of the 252 supernatant (corresponding to plasma) were pipetted into a NTDscope rectangular 253 capillary for video acquisition. Snapshots of this video are shown in Fig 2A, and the full 254 video can be found in Supplementary Video 2. 255

To determine the expected correlation between actual microfilariae concentration in 256 a sample and the number of microfilariae that could be identified from the videos 257 acquired on the NTDscope, we prepared three capillaries and two calibrated thick 258 smears from a sample of a cat infected with *B. malayi*. We then manually counted 259 worm movements in the videos and counted the visible mf in the calibrated thick smears. 260 The thick smear and manual capillary counts are shown in Fig 2D. There is a decrease 261 in the manual capillary counts compared to the thick smears, which was also seen 262 in [36], and could be due to a fraction of dead mf that are counted in the thick smears 263

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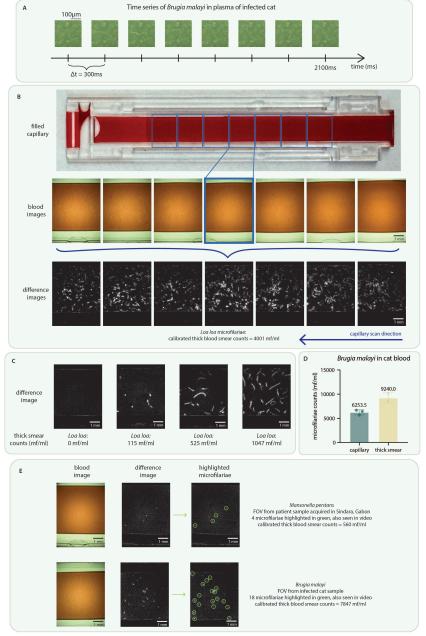


Fig 2. **NTDscope for live imaging of microfilariae in blood and plasma samples A** Time series showing the movement of a *Brugia malayi* microfilaria in plasma of an infected cat. **B** (top) image of a capillary filled with peripheral blood of a human patient infected with *Loa loa*, collected and imaged in Cameroon, (middle) screenshots of the videos corresponding to the 7 FOVs imaged for the capillary, (bottom) difference images generated from the 7 videos. The patient had calibrated thick smear counts of 4001 mf/ml. A video of the middle (highlighted) FOV is shown in Supplementary Video 1.**C** Difference images generated from four different patients in Cameroon, three of which were infected with *Loa loa* mf (thick smear counts 115-1047 mf/ml) and one patient who was negative for *Loa loa*. **D** Comparison of microfilariae counts from a calibrated thick smear and counted manually from videos acquired on the NTDscope, for a blood sample infected with *B. malayi* mf. **E** Snapshots of videos and corresponding difference images of samples containing *M. perstans* (top) and *B. malayi* (bottom) mf. The mf identified in videos and difference images are circled in green. Data was processed and visualized using GraphPad Prism 10.

> but are not captured in difference images, or due to live mf that do not make it into the 264 capillaries due to their shape and size. 265

> Different filarial species have distinct movement signatures, which can be seen by 266 examining difference images from samples with mf of different species. Fig 2E shows the 267 difference images of a sample of a human patient infected with M. perstans, collected in 268 Gabon, and difference images of a blood sample of a cat infected with B. malayi. The 269 intensity peaks corresponding to the location of mf movement in the FOVs are marked 270 by green circles. The peaks are smaller for M. perstans when compared to those 271 produced by *B. malayi* and even *Loa loa* (seen in Fig 2B and C). This implies that 272 M. perstans microfilariae consistently create much smaller areas of blood displacement 273 as compared to Loa loa and B. malayi. These signatures could eventually be used to 274 distinguish between filarial species. 275

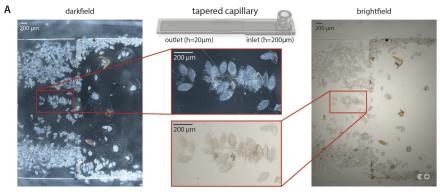
Multi-contrast imaging of helminth eggs

The NTD scope can be used to image parasite eggs in urine and stool samples with 277 minimal processing. For imaging of Schistosoma haematobium eggs in patient urine 278 samples, we used a tapered capillary described in [32] and shown in Fig 3A. The 279 capillary has a rectangular channel with a height that tapers down from 200µm near the 280 inlet to 20µm near the outlet hole. These capillaries can be connected to a syringe to easily flow liquids through, including urine and stool processed with a flotation solution. 282 The tapered design ensures that parasite eggs are trapped along the channel, at a 283 location dependent on their size. The external dimensions of the tapered capillary are 284 such that it can be inserted into the NTDscope carriage for imaging. Fig 3A shows S. 285 haematobium eggs imaged using brightfield and darkfield illumination on the NTDscope. 286 The eggs are from patient urine samples collected in Côte d'Ivoire. 287

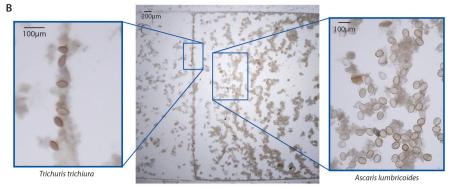
The NTD cope can also be used to image soil-transmitted helminth (STH) eggs 288 found in patient stool samples. STH is traditionally detected using the Kato-Katz 289 method, a time-consuming technique that involves sieving, staining and smearing a stool 290 sample onto a glass slide for imaging using a microscope [46]. An improvement on this 291 method has been the Mini-FLOTAC technique [47], in which the stool is homogenized 292 and mixed with a flotation solution (using a kit called the Fill-FLOTAC), such that 293 eggs can be concentrated and separated from stool particulates. After flotation, the 294 samples are loaded into the Mini-FLOTAC apparatus, which is used for microscopic 295 examination of the sample and identification of parasitic eggs. We used the FLOTAC 296 technique to process stool samples taken from a patient with known STH infection in 297 Cameroon. The sample was homogenized and mixed with a flotation solution using a 298 Fill-FLOTAC. Then, instead of loading the sample into a Mini-FLOTAC and imaging 299 on a microscope, we injected the floated stool solution into the NTDscope tapered 300 capillary. This capillary is particularly useful for samples that contain multiple STH 301 species, which are separated into different locations of the capillary due to their 302 different sizes. As seen on the image in Fig 3B, the bigger Ascaris lumbricoides eggs 303 (45-75 µm thick) were concentrated on the right side of the image, corresponding to the 304 region of the capillary closest to the inlet, while the smaller *Trichuris trichiura* eggs 305 (20-25 µm thick) were concentrated on the left side, closest to the capillary outlet hole. 306

We also explored an alternative, simpler, method for stool sample processing using 307 the Fecalyzer, a device that is similar to the Fill-FLOTAC but is smaller, cheaper and 308 more commonly used for veterinary applications [48]. To prevent clogging issues on the 309 tapered capillary due to unfiltered stool particulates, we developed a prototype capillary 310 using two thin pieces of laser-cut acrylic coated with a hydrophilic solution (Tetronic 311 904 dissolved in isopropanol alcohol), that could be inserted into the NTDscope for 312 imaging. We used the Fecalyzer to homogenize 0.2 grams of stool and added ~ 14 mL of 313 a zinc sulfate (ZnSO4) flotation solution such that a meniscus formed. We placed the 314

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S. haematobium eggs from patient urine sample imaged in Côte d'Ivoire



Patient stool sample processed in flotation-based assay in Cameroon

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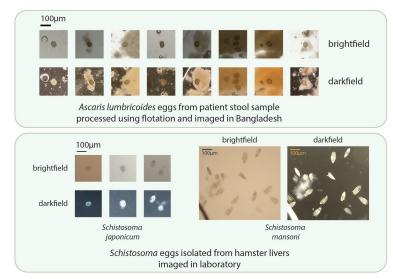


Fig 3. NTDscope can image parasitic eggs in urine and stool A Images of Schistosoma haematobium eggs from a urine sample of a patient in Côte d'Ivoire, acquired using brightfield (BF) and darkfield (DF) imaging. B Image of soil-transmitted helminth (STH) eggs from a patient stool sample processed using a flotation-based assay and imaged using the NTDscope in Cameroon. Insets showing Trichuris trichiura (left) and Ascaris lumbricoides (right) eggs captured in different locations of the NTDscope tapered capillary. C (top) images of A. lumbricoides eggs from a patient stool sample, processed with a flotation solution and imaged using BF and DF illumination on the NTDscope in Bangladesh. (bottom) Schistosoma japonicum and Schistosoma mansoni eggs isolated from hamster livers and imaged on the NTDscope using BF and DF illumination.

> coated acrylic pieces on top of the meniscus and waited 15 minutes to allow the STH 315 eggs in the stool sample to float to the top and adhere to the acrylic surface. The 316 acrylic pieces were then removed and inserted into the NTDscope for imaging. Fig 3C 317 (top) shows A. lumbricoides eggs from patient stool samples collected and processed as 318 described above, in an STH-endemic area in Bangladesh. In addition to decreasing cost, 319 sample preparation steps, and required materials for STH detection, this is an example 320 of how new assays and sample processing techniques can be easily adapted for imaging 321 on the NTDscope. 322

> Lastly, we show that the NTDscope can be used to image *Schistosoma* eggs of 323 different species, including S. japonicum and S. mansoni. We used viable schistosoma 324 eggs extracted from livers of infected hamsters (provided by the Schistosomiasis 325 Resource Center of the Biomedical Research Institute (Rockville, MD)) and observed 326 that the NTD scope resolution is sufficient for the eggs of different species can be 327 differentiated by eye on the NTDscope images (as shown in Fig 3C (bottom). We also 328 acquired videos of S. mansoni miracidia hatched from liver-extracted eggs in brightfield 329 and darkfield illumination, one of which is shown in Supplementary Video 3. 330

Imaging of stained patient samples

We explored the use of the NTDscope for imaging of fixed and stained slides, which could be useful in clinical laboratory settings where fixing and staining of samples is routine. We first developed an NTDscope-compatible capillary to simulate a thick smear (Fig 4A). This capillary is made from laser cut-pieces of acrylic and is coated with a hydrophilic solution (Tetronic 904 in isopropanol alcohol). The capillary holds a fixed volume of blood (30µL) and can be fixed and stained following a standard Giemsa staining protocol. We prepared a thick smear capillary using a blood sample of a cat infected with *B. malayi* microfilariae, stained it using Giemsa and imaged it with the NTDscope. Given the large field of view of the NTDscope, only seven images were required to cover the entire sample. The stiched images are shown in Fig 4A. The NTDscope could resolve the *B. malayi* microfilariae well, and this is another demonstration of how the NTDscope can be adapted for other relevant assays.

To explore whether the NTDscope could be used for imaging other relevant parasites, we modified a device slightly such that it could fit standard microscope slides and imaged fixed and stained slides sourced from Carolina Biological. We imaged Entamoeba histolytica, Trichomonas vaginalis, and Leishmania donovani promastigotes. 347 The L. donovani promastigotes were too small $(1-2\mu m)$ to fully resolve with the NTDscope; computational techniques, such as dithering, could improve the resolution of the NTDscope such that these and other parasites (e.g. malaria) can also be imaged on the device [49].

Imaging of lateral flow assays

To test the ability of the NTDscope to quantify lateral flow assays (LFAs), we imaged 353 two commercially-available lateral flow assay strips for severe acute respiratory 354 syndrome coronavirus 2 (SARS-CoV-2) antigen detection, one processed using a positive 355 patient sample and one using a negative patient sample. The lateral flow strips were 356 removed from their plastic housing and attached to a glass support with dimensions of 357 the NTDscope carriage. The patient nasal swab collection and processing was done 358 according to the manufacturer, and the three drops of swab solution and assay 359 components were added to the strips and immediately imaged using the NTDscope. For 360 the positive sample, images of the test line were acquired every minute for five minutes. 361 End-point images were also acquired 15 minutes after the start of the assay. 362

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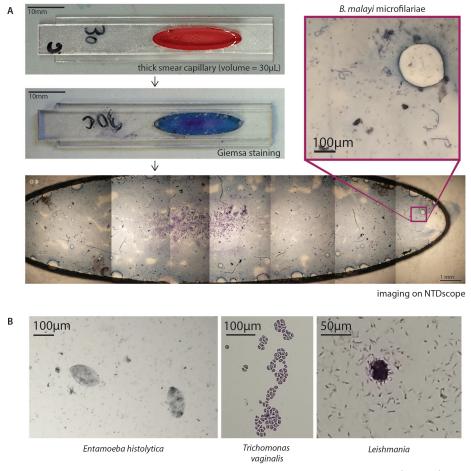


Fig 4. The NTDscope can image parasites on fixed and stained slides A (top left) picture of a thick smear capillary designed to be imaged with the NTDscope, including 30μ L of blood from a cat infected with *Brugia malayi*. (middle left) Thick smear capillary after Giemsa staining. (bottom) stitched images of Giemsa-stained capillary, collected with the NTDscope, with an inset showing 6 *B. malayi* microfilariae (top right). The full video shown in Supplementary Video 3. **B** Images of fixed and stained slides with parasites, collected on the NTDscope, showing (left) *Entamoeba histolytica*, (middle) *Trichomonas vaginalis*, and (right) *Leishmania donovani* promastigotes.

Figure 5A.i. includes a time-lapse of the test band for the positive patient, showing how the intensity of the band increases in time (as shown by a decrease in pixel intensity, Fig 5A.ii.). We also show the control and test bands for two positive samples and one negative sample (Fig 5A iii.) and a scan of the entire strip showing the control and test band for a positive patient.

Imaging a CRISPR-Cas13a SARS-CoV-2 assay

Detection of RNA or DNA with Clustered Regularly Interspaced Short Palindromic Repeats (CRISPR) is a promising approach for diagnosis of infectious diseases [50]. To demonstrate ability of the NTDscope to detect a CRISPR reaction, we leveraged the device's fluorescence capabilities to image a CRISPR-Cas13a assay for the detection of SARS-CoV-2 (Fig 5B).

As previously described [51], we used CRISPR-Cas13a with a CRISPR RNA (crRNA, also known as a guide RNA) to recognize a specific sequence in the SARS-CoV-2 N gene. Briefly, the crRNA is incubated with the Cas13a enzyme to form 376

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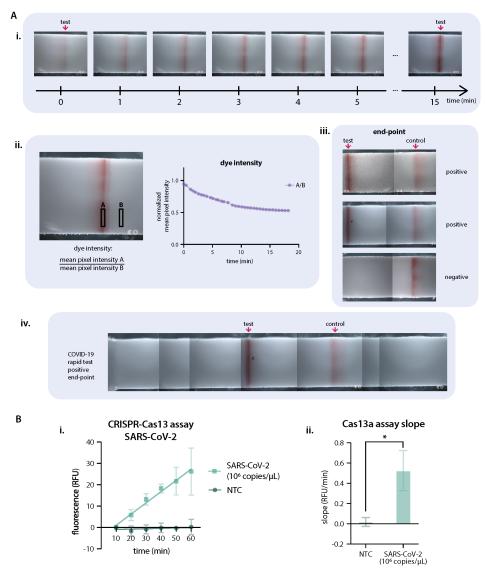


Fig 5. The NTDscope can be used to image lateral flow test strips and CRISPR-Cas molecular assays A Lateral flow assays imaged on the NTDscope. A.i. Time series (15 min) of the test line on a COVID-19 antigen test, tested on a positive patient. A.ii. Measurement of the dye intensity over time, of the test line shown in A.i., calculated by dividing the mean pixel intensity of a rectangular region of interest (ROI) over the test line by an ROI outside of the test line. Pixel intensity was measured using Fiji (ImageJ). A.iii. End-point images after 15 minutes for three COVID-19 tests (2 positive, 1 negative), showing the test and control lines. A.iv. Scan of the entire COVID-19 test strip, showing the control and test bands for a positive patient after 15 minutes. B Results of a CRISPR-Cas13 assay run on NTDscope. B.i. Measurement of fluorescence intensity over time for a Cas13 assay with a guide RNA specific to SARS-CoV-2, in the presence (SARS-CoV-2 1e6 copies/ μ L) and absence (non-target control — NTC) of synthetic SARS-CoV-2 RNA. Fluorescence intensity was measured during the first 60 minutes of assay time, measurements were acquired every 10 minutes. The data from the first 10 minutes was discarded to allow assay components to equilibrate to temperature. Experiment performed in triplicate. B.ii. Slopes of the curves calculated by performing simple linear regression of the data for each replicate of B.i., slopes of the positive samples were compared to the no target RNA controls (NTC) using an unpaired t-test. * is $p \leq 0.05$. Data were processed and visualized using GraphPad Prism 10.

a ribonucleoprotein that is activated to nonspecifically cleave a ssRNA reporter-quencher upon target sequence recognition. The enzyme Cas13a was expressed 378

> and purified as previously described, and the crRNA for SARS-CoV-2 and a synthetic target were ordered from Synthego [51]. The ssRNA reporter-quencher was modified from [51] to include a 5' ATTO425 fluorophore and a 3' IowaBlack FQ quencher. The assay was prepared by preassembling Cas13a-crRNA RNP complexes for 15 minutes at room temperature, after which the ssRNA reporter and the target RNA at either 1×10^6 copies of RNA per µL (cp/µL) for positive controls or 0 cp/µL for the non-target control (NTC) were added.

For NTDscope fluorescence measurements, the CRISPR-Cas13a reactions were loaded individually into two-5µL glass capillaries (Vitrocom, cat# 5010-050), which were attached to a modified glass slide (12mm x 75mm x 1mm) using a double-sided adhesive (ARcare 90445Q) to fit the NTDscope carriage. In each of the three glass slides prepared, there were two glass capillaries, containing two reactions (Positive and NTC). We used the fluorescence imaging capabilities of the NTDscope to image each glass slide every 10 minutes for 60 minutes after equilibration to the assay temperature of 37°C. Fluorescence signal was quantified using ImageJ Fiji by taking an average of pixel intensity of a fixed pixel area across all images in the time series for the positive and the NTC reactions. A plot of the fluorescent signal over time was generated using the measured pixel intensities (Fig 5B.i.). Slopes of the curves were calculated by performing simple linear regression of the data for each replicate (Fig 5B.ii.). Slopes of the positive samples were compared to the NTC using an unpaired t-test.

The slope of the fluorescence increase for the positive sample measured on the 399 NTDscope was significantly larger than the slope of the non-target control, confirming 400 SARS-CoV-2 RNA detection by Cas13a. Additionally, the slope of the line for 1×10^6 401 $cp/\mu L$ produces similar results to slopes seen when the assay was run on a 402 temperature-controlled plate reader (Supplementary Fig 1). To make the plate reader 403 measurements, 15 µL reactions were loaded into individual wells from a 384-well plate 404 and incubated in a plate reader (TECAN, Spark) for 60 minutes at 37°C, with 405 fluorescence intensity measurements taken every 2.5 minutes (λ_{ex} : 425 nm; λ_{em} : 500 406 nm). The slope of the reactions starting at 10 minutes (to account for assay 407 temperature equilibration) was calculated by linear regression of the mean 408 background-subtracted reaction rate (RFU/sec) with SEM. The plate reader results are 409 shown in Supplementary Fig 1. All data were compared using an unpaired t-test. 410

Discussion

In this work, we presented the design of the NTDscope, a portable, multi-contrast 412 microscope that enables diagnosis of neglected tropical diseases at the point-of-care. We 413 demonstrated its imaging capabilities for microfilariae in peripheral blood, Schistosoma 414 eggs in urine samples, and STH eggs in processed stool samples. We also showed that 415 the device is capable of reading molecular assays by imaging both lateral flow assays 416 and fluorescence-based CRISPR-Cas assays. Sample preparation is simplified for these 417 applications by the use of disposable plastic capillaries, including rectangular straight 418 channel capillaries for defined blood volumes, tapered capillaries for filtering eggs from 419 urine and floated stool samples, and as well as a prototype capillary for thick blood 420 smears that is compatible with the NTDscope. 421

As new diagnostic applications are developed for the NTDscope, new capillary designs that fit the carriage dimension and focal plane can be designed. The original straight channel capillary was designed to easily load a peripheral blood sample for quantification of microfilariae, but it can also be loaded with other liquids for other uses. Previous applications have included imaging of parasitic eggs isolated from a flotation solution using the Fill-FLOTAC or Fecalyzer devices, as well as imaging of diatoms in marine samples for educational purposes. The tapered capillary that was designed to

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isolate *Schistosoma* eggs from urine has also proven useful for other applications that require size-exclusive filtering and concentration, such as separating two different species of STH eggs.

The prototype thick smear capillary demonstrates potential for integrating common 432 clinical laboratory assays into the device, including wet mounts for protozoa and fungi, 433 three-part blood counts, and parasitic egg viability assays [52,53]. The ability to capture 434 images of live parasites has the potential to provide new information about infections 435 and response to treatment. For example, NTDscope videos of Loa loa microfilariae 436 motion inherently capture only live parasites rather than dead microfilariae that could 437 appear in conventional thick smear microscopy. In the case of low parasitemia, 438 additional FOVs and multiple capillaries from a single patient can be analyzed, which 439 could improve sensitivity for treatment stopping decisions in near-elimination settings. 440

The diagnostic power of the NTDscope is enhanced by integrating machine learning 441 (ML) for automated analysis of patient samples. Importantly, use of ML can 442 significantly reduce the time required for sample analysis, including manual counting of 443 parasites that can take a minimum of 10 minutes per slide for well-seasoned 444 technicians [54] and can have high variability [55, 56], reducing fatigue as well as 445 increasing throughput. Use of the Android OS environment allows existing ML models 446 designed for mobile applications to be easily run on the device. Furthermore, the 447 portability of the NTDscope simplifies data collection for NTDs, increasing the amount 448 of available training data for ML models, which is particularly important for capturing 449 patient samples in NTD-endemic regions where microscopes with digital cameras are 450 unavailable. Beyond classification of parasites in static images, ML models have the 451 potential to differentiate microfilarial species based on movement signatures, which we 452 have observed to be different for *M. perstans*, *B. malayi*, and *Loa loa* microfilariae 453 (Fig 2). As more field data is collected, ML algorithms could be developed to 454 distinguish between multiple filarial species. For some diagnostic uses cases, visualizing 455 an ML-highlighted parasite on the screen of the NTDscope could help to build 456 confidence in the tool for both providers and patients. 457

The multi-contrast imaging capabilities of the NTDScope could prove useful for future diagnostic applications that involve species differentiation, such as for distinguishing soil transmitted helminth species and *S. mansoni* eggs in stool samples. Darkfield imaging has proved beneficial when used for ML-based identification of *S. haematobium* eggs, where models trained on darkfield images performed better than those trained on brightfield images [34]. Darkfield illumination is particularly helpful when distinguishing eggs from other debris found in samples, which is typically achieved through staining, requiring extra steps and assay components. Given that many parasitic eggs and worms exhibit autofluorescence [57–60], the NTDscope could further facilitate speciation with its fluorescence capabilities.

The fluorescence capabilities of the NTDscope provide the potential to replace bulky 468 laboratory equipment, such as plate readers for molecular assays. Fluorescence-based 469 molecular assays, such as those based on CRISPR-Cas enzymes, are of growing interest 470 for infectious disease diagnosis as they avoid the need for conventional PCR machines 471 and temperature cycling (amplification-free CRISPR-Cas reactions are isothermal). 472 CRISPR-Cas diagnostic assays have been demonstrated for the detection of neglected 473 diseases including Schistosomiasis [61, 62], Trypanosomiasis [63], Leishmaniasis [64], 474 Malaria, [65], Zika, Dengue [66], and others [67–69]. These reactions can be read using 475 portable devices [51,70], and could be adapted to be read using the NTDscope. We also 476 showed that the NTDscope can be used to read the results of lateral flow assays. While 477 multiple portable LFA readers exist [71-76], the potential to read test strips with a 478 magnified imaging system could improve sensitivity in cases of light infection, help 479 digitize results for future use, and open the possibility of combining multiple tests onto 480

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a single test strip, reducing the quantity of reagents needed [77–82].

Presently, the main limitation of the NTDscope lies in device availability. The 482 NTDscope presented here is a prototype built to demonstrate the feasibility of a 483 fully-integrated diagnostic device for multiple NTDs, and 80 devices were built in a 484 limited manufacturing run. Collaborators in Cameroon, Gabon, Côte d'Ivoire, and 485 Bangladesh continue to work with the device to establish efficient workflows for 486 expanded use, as well as explore additional diagnostic and disease mapping applications. 487 With additional feedback from ongoing field work, future versions of the device have the 488 potential to be manufactured or assembled in the countries where they are used. The 489 NTDscope represents an important step toward increasing access to disease testing in 490 regions with limited healthcare infrastructure through portable diagnostic technology, a 491 direction that may also benefit regions beyond those with NTDs. 492

Conclusion

The NTDscope is a portable, multi-contrast microscope designed to diagnose neglected 494 tropical diseases at the point-of-care. It features high-resolution imaging at a low cost, 495 achieved by taking advantage of high-quality, mass-produced consumer electronic parts, 496 such as mobile phone lenses. The device is compact, user-friendly, and doesn't require 497 mains electricity to run. Here, we demonstrate use of the NTDscope for a diverse set of 498 assays and samples in laboratory and field settings including Cameroon, Gabon, 499 Bangladesh, and Côte d'Ivoire. When combined with machine learning for automated 500 diagnostics, the NTDscope has the potential to increase the reach and impact of 501 healthcare professionals. The portability of the NTDscope can also increase the amount 502 of image data collected from patients with NTDs, a necessary step for training of 503 machine learning models that has been difficult to achieve in NTD-endemic regions. We 504 envision the NTDscope as a platform technology that addresses diagnostic needs for 505 multiple NTDs and supports ambitious disease control and elimination programs. 506

Supporting information

Supplementary Figure 1. CRISPR-Cas13a assay results on plate reader. i. Measurement of fluorescence intensity over time for a Cas13 assay with a guide RNA specific to SARS-CoV-2, in the presence (SARS-CoV-2 1e6 copies/µL) and absence (non-target control — NTC) of synthetic SARS-CoV-2 RNA. Fluorescence intensity was measured on a Tecan Spark plate reader during the first 60 minutes of assay time, measurements were acquired every 10 minutes. The data from the first 10 minutes was discarded to allow assay components to equilibrate to temperature. Experiment performed in triplicate. ii. Slopes of the curves calculated by performing simple linear regression of the data for each replicate of i., slopes of the positive samples were compared to the no target RNA controls (NTC) using an unpaired t-test. Data are expressed as mean +- standard error of the mean (SE). * is p<0.05; ** is p<0.01; **** is p<0.001. Data was processed and visualized using GraphPad Prism 10.

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Supplementary Video 1. Loa loa microfilariae in peripheral blood.

Video showing a field-of-view (FOV) of a capillary filled with peripheral blood of a human patient infected with *Loa loa*, collected and imaged in Cameroon. This corresponds to the fourth FOV from left to right in Fig 2B. The patient had calibrated thick smear counts of 4001 mf/ml.

Supplementary Video 2. Brugia malayi microfilariae in plasma.

Video showing multiple *B. malayi* microfilariae in plasma of an infected cat.

Supplementary Video 3. S. mansoni miracidia

Video showing *S. mansoni* miracidia hatched from eggs extracted from livers of infected hamsters. The sample was imaged under brightfield and darkfield illumination.

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• Funding acquisition: MDK, ALLN, MLO, JK, MR, IIB, JTC, DHF, MVDA, DAF	525
• NTDscope design: NAS, DHF, MVDA, DAF	526
• NTDscope assembly: MDDLD, CFN, JPC, MDK, ALLN, NAS, DHF, MVDA, DAF	527 528
• Software: DB, CBD, JGV, ED, DBP, DC, MLO, MVDA	529
• Supervision: MDK, ALLN, HCND, JK, RZM, MR, IIB, JTC, NAS, DHF, MVDA, DAF	530 531
• Field validation: MDDLD, ZLM, AMB, MDK, ALLN, JGV, ED, DBP, DC, MLO, HCND, JK, LDY, VP, SDD, RZM, IIB, JTC, AK, MK, ZN, RH	532 533
• Writing – original draft: MDDLD, ZLM, CFN, NAS, DAF	534
• Writing – review & editing: all authors	535

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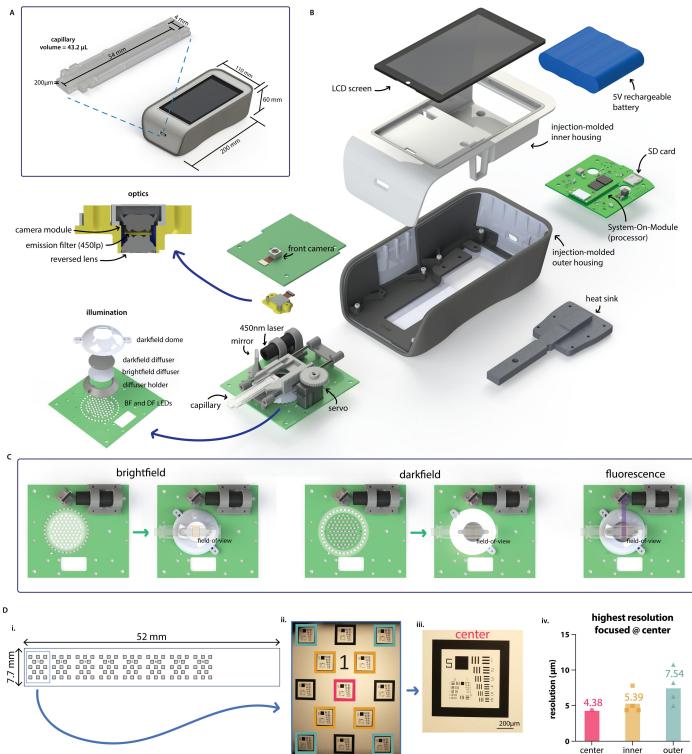
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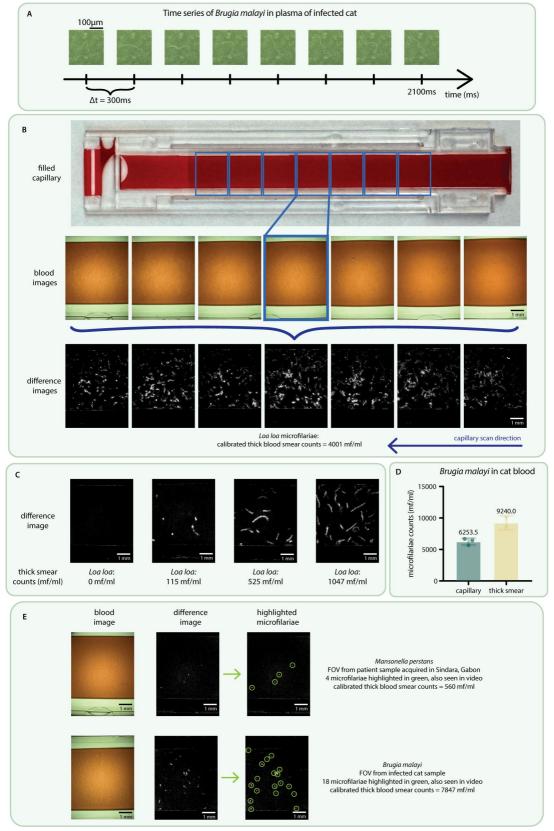
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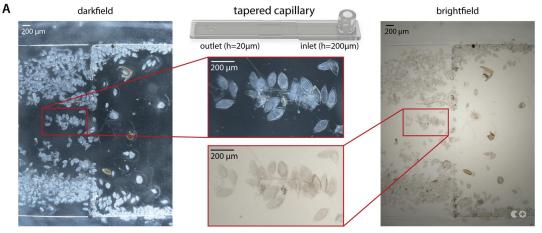
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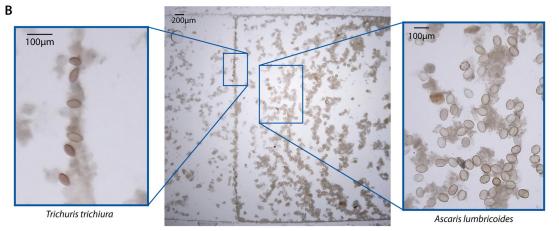


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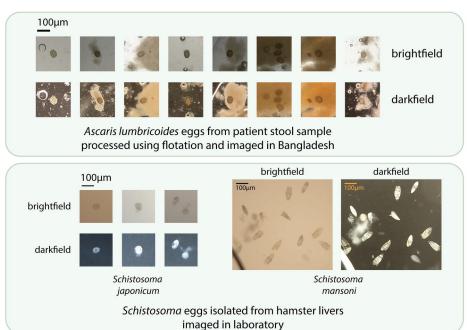


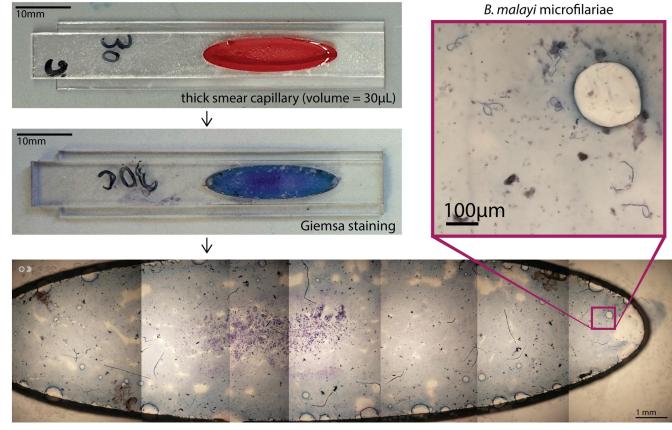
S. haematobium eggs from patient urine sample imaged in Côte d'Ivoire



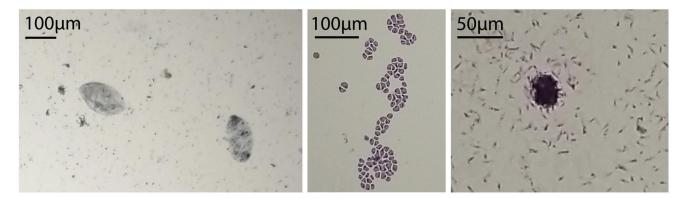
Patient stool sample processed in flotation-based assay in Cameroon

С





imaging on NTDscope



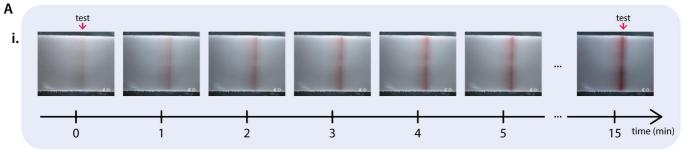
Entamoeba histolytica

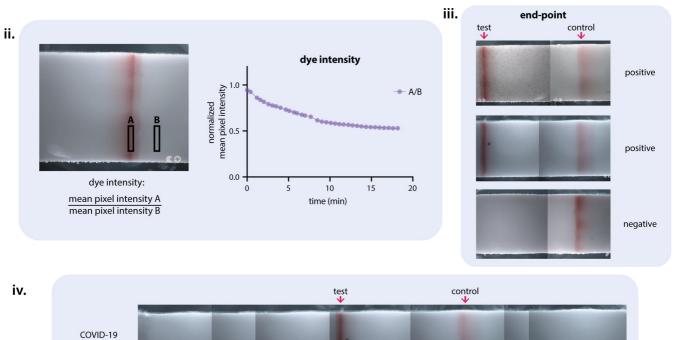
Α

В

Trichomonas vaginalis

Leishmania





В

rapid test positive end-point

