



# Antibiotic susceptibility testing in less than 30 min using direct single-cell imaging

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**The emergence and spread of antibiotic-resistant bacteria are aggravated by incorrect prescription and use of antibiotics. A core problem is that there is no sufficiently fast diagnostic test to guide correct antibiotic prescription at the point of care. Here, we investigate if it is possible to develop a point-of-care susceptibility test for urinary tract infection, a disease that 100 million women suffer from annually and that exhibits widespread antibiotic resistance. We capture bacterial cells directly from samples with low bacterial counts (10<sup>4</sup> cfu/mL) using a custom-designed microfluidic chip and monitor their individual growth rates using microscopy. By averaging the growth rate response to an antibiotic over many individual cells, we can push the detection time to the biological response time of the bacteria. We find that it is possible to detect changes in growth rate in response to each of nine antibiotics that are used to treat urinary tract infections in minutes. In a test of 49 clinical uropathogenic *Escherichia coli* (UPEC) isolates, all were correctly classified as susceptible or resistant to ciprofloxacin in less than 10 min. The total time for antibiotic susceptibility testing, from loading of sample to diagnostic readout, is less than 30 min, which allows the development of a point-of-care test that can guide correct treatment of urinary tract infection.**

point of care | UTI | AST | antibiotic | resistance | microfluidic

**W**ith the ever-increasing emergence and spread of antibiotic-resistant bacteria, a key factor in correct treatment of infections is the ability to rapidly identify the antibiotic susceptibility profile of the infecting species to assure the use of an efficacious antibiotic and reduce the need for broad spectrum drugs (1–3). Phenotypic antibiotic susceptibility tests (ASTs) are typically based on the detection of differential bacterial growth with and without antibiotics in liquid cultures or on solid agar plates (4). In liquid tests, detection is based on the change in OD, whereas the disk diffusion method is used on solid agar plates to identify inhibition zones (5). These methods are generally reliable for detecting resistance and determining the antibiotic concentration that prevents bacterial growth, making them predictive of the therapeutic utility of different antibiotics. However, because it typically takes 1–2 d to get a reliable readout, these methods fail to guide treatment in the early, often critical, stages of infection. As a consequence, the physician is left with the difficult choice of prescribing a broad spectrum antibiotic or risking that the first prescribed antibiotic is ineffective.

Genotypic ASTs are based on detection of a specific genetic marker (plasmids, genes, or mutations) associated with resistance phenotypes by using the common genetic tools (e.g., sequence-specific amplification by PCR, padlock probe-mediated rolling circle amplification, or whole-genome sequencing) (3, 6). These tests are highly sensitive and can limit the detection time to what is needed to amplify selected DNA sequences to detectable levels, but they require detailed advance knowledge of which resistance markers to test for. If new resistance mechanisms arise, these would go undetected and result in false negatives. Furthermore, the presence of certain resistance genes/mutations does not necessarily translate into phenotypic resistance.

Unlike the genotypic ASTs, the phenotypic ASTs directly assess if the antibiotic stops bacterial growth, which is the most relevant measure for the treating physician. New phenotypic ASTs have, therefore, been developed in recent years to decrease the detection times. In particular, microfluidics (7) have made it possible to increase the signal to background ratio in the phenotypic assays by miniaturizing the bacterial incubation chambers (8). Using microfluidic approaches, it has been possible to push the time requirement for AST to 1–3 h (9–13). Recent promising data based on relative DNA copy number increase in antibiotic-treated vs. reference cultures quantified using digital PCR suggest that a biological response can be detected already 15 min after exposure to an antibiotic (14). However, the PCR step still takes an additional 60 min, making this test too slow for a point-of-care application. Here, we use direct single-cell imaging to show that it is possible to determine if a bacterial isolate is susceptible to an antibiotic in less than 10 min. When we include the time for loading a dilute sample, the total time for the test is less than 30 min, such as would be required for a point-of-care application.

Urinary tract infection (UTI) is one example where a fast AST could improve medical practice by making it possible to prescribe an antibiotic to which the infecting bacteria are susceptible before the patient leaves the primary care unit. A fast AST for UTI would have an important clinical impact given that there are 100 million cases of UTI per year worldwide, with high frequency of resistance to primary antibiotics (15). Because 85% of all UTI cases diagnosed in primary care are caused by *Escherichia coli*, we have focused on this species, but the test can be expanded to

## Significance

**Antibiotic resistance is a global threat to human health. The problem is aggravated by unnecessary and incorrect use of broad spectrum antibiotics. One way to provide correct treatment and slow down the development of antibiotic resistance is to assay the susceptibility profile of the infecting bacteria before treatment is initiated and let this information guide the choice of antibiotic. Here, we present an antibiotic susceptibility test that is sufficiently fast to be used at the point of care. We show that it is possible to determine if a urinary tract infection is caused by resistant bacteria within 30 min of loading a urine sample, even if the bacterial concentration in the urine is very low.**

Author contributions: Ö.B., D.I.A., and J.E. designed research; Ö.B. performed research; E.T. contributed clinical isolates and their resistance classification; Ö.B. and A.B. analyzed data; and Ö.B., D.I.A., and J.E. wrote the paper.

Conflict of interest statement: The chip design is being patented (PCT/SE2015/050685). The fast antibiotic susceptibility test is being developed into a product by a company of which Ö.B. and J.E. are shareholders.

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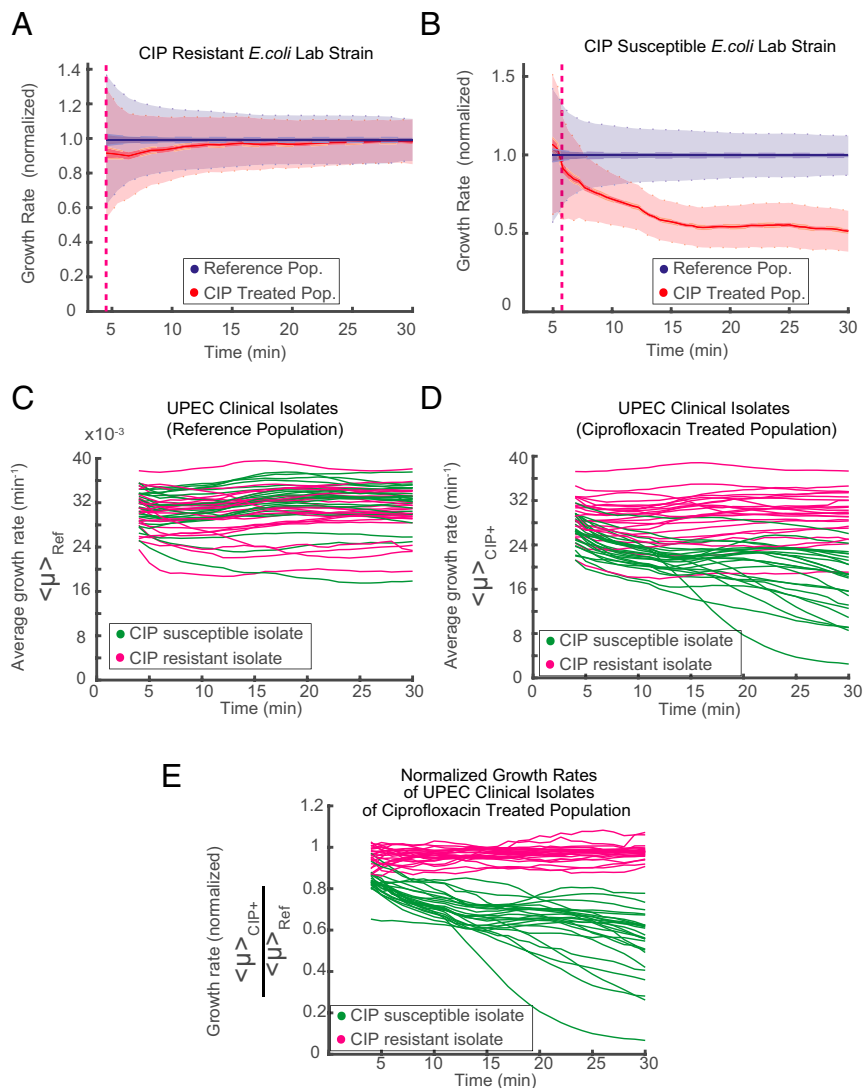
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**Fig. 4.** fASTest for resistant and susceptible strains. Laboratory strains of (A) CIP-resistant and (B) -susceptible *E. coli* are tested for CIP susceptibility. (C–E) Forty-nine clinical isolates of UPEC are tested with fASTest for CIP susceptibility. (C) Average growth rates for the reference populations. (D) Average growth rates for the treatment populations. Color coding indicates magenta for clinically resistant to CIP and green for clinically susceptible to CIP. (E) Growth rate of treated populations normalized for the growth rate of the respective reference population.

A challenge related to contamination is polymicrobial infections. These are rare for uncomplicated UTIs but commonly observed for, for example, catheter users (21). Because we detect all bacteria in the sample and do not only detect those that grow under standard plating assays, polymicrobial infections can be detected as a high diversity of growth rates in the reference channel. If the mixed strains also display a diverse resistance pattern, this would be observed as a broadened growth rate distribution after antibiotic treatment. An actual point-of-care test would, therefore, have to consider other aspects of the growth rate distribution than just the average. There may, for example, be specific automated indications if a few individual bacteria keep growing fast in a background of dying cells, because this may indicate a polymicrobial infection with a complex resistance spectrum. An alternative strategy for the test to deal with polymicrobial infections and contaminations is to make it time sequential, such that the growth rate is determined for the cells in each cell trap before and after antibiotic treatment. This allows for focusing the analysis on only growing cells and avoiding biases in the averaging caused by an uneven distribution of different species between the

reference channel and the treatment channel. A test also needs to consider the possible situation where the cells in the reference channel grow so slowly that a lack of response in treatment channel would be unreliable.

We have here focused on bacterial species and antibiotics related to UTIs, but it is likely that the same principles would work for sepsis, mastitis, or meningitis (i.e., in blood, milk, or cerebrospinal fluid that normally should be devoid of bacterial-sized cells). Independent of the sample, the key principle will be true: it is sufficient to measure the single-cell growth of a few hundred bacteria to get very close to the theoretical time limit for monitoring the response to an antibiotic in real time.

In summary, samples with more than  $10^4$  cfu/mL can be loaded in less than 10 min, and thus, no precultivation is needed for patient urine samples. Furthermore, any eukaryotic cell in the sample will be too large to pass through the filtration region within the microfluidic chip or enter the cell channels and disturb the assay. Thus, the combined AST time (loading, measurement, and readout) of the sample is less than 30 min. Based on the small clinical study of CIP susceptibility, the observed sensitivity and specificity of the

assay are in 100% agreement with existing but prohibitively slow methodology.

## Materials and Methods

**The Microfluidic Chip.** The microfluidic chip consists of a cover glass (1.5) and a micromolded silicon elastomer [Sylgard 184; polydimethylsiloxane (PDMS)] that are covalently bonded together. For micromolding, we used the standard soft lithography techniques as described in *SI Materials and Methods*.

**fASTest Protocol.** All of the fASTest runs described in this paper follow this common protocol: growth of overnight culture (ONC), growth of loading culture, connection of microfluidic flow control setup to the microfluidic chip, aligning the chip to the camera, selection of positions to be imaged, running an imaging test to ensure the stability of the microfluidic chip, connecting the loading culture to the macrofluidic setup, loading the cells from loading culture, and starting the antibiotic application and automated phase contrast microscopy.

**Bacterial Strains.** The strains used were WT strain DA5438 (*E. coli* MG1655), ampicillin-resistant strain DA28097 [*E. coli* del(*PlacI\_lacIZYA*::amp)], CipR strain DA20859 (*E. coli* *gyrA1*-S83L, *gyrA2*-D87N, *parC*-S80I), and two other species: DA12755 (*K. pneumoniae*; ATCC13883) and DA14015 (*S. saprophyticus*).

**GM.** Depending on the experiment, we used either Mueller–Hinton Broth (70192–500G; Sigma-Aldrich) or urine as GM. When indicated, the GM was supplemented with an antibiotic. In preparation of urine media, morning urine was collected, and filtered (nitrocellulose filter; 0.2- $\mu$ m pore size). All media are supplemented with a surfactant [Pluronic F-108; 542342; Sigma-Aldrich; 0.085% (wt/vol) final concentration] to prevent the attachment of the bacteria to the PDMS surface.

**Culture Conditions.** For ONC, bacteria from the glycerol stocks were inoculated into 2 mL GM and incubated (37 °C; shaking at 225 rpm) for ~16 h. For loading culture, 2.5  $\mu$ L ONC is diluted 1:800 to a total of 2 mL GM and incubated (37 °C; shaking at 225 rpm) for 120 min. For growth in the chip, the chip was continuously supplied with GM and incubated in the microscope cage incubator at 37 °C before, during, and after the loading of bacterial culture and also, during the test. The loading culture was connected to the fluidic setup and kept in the cage incubator at 37 °C. GM was kept outside of the cage incubator at room temperature (21 °C).

**Microfluidic Flow Control Setup Details.** Flow direction and rate during the experiment were maintained by pressure-driven flow. An electropneumatic

controller from Elveflow (OB1 MkIII) regulated the air pressure applied to the closed fluidic reservoirs. Pressures, flow rates, and tubing details are explained in *SI Materials and Methods*. The electropneumatic controller was programmed in MATLAB.

**Automated Phase Contrast Microscopy.** We used a Nikon Ti-E inverted microscope with a 20 $\times$  objective (CFI Plan Apo Lambda DM 20 $\times$  or CFI S Plan Fluor ELWD ADM 20 $\times$ ), with a motorized x–y stage, and a CMOS camera (DMK23U274; The Imaging Source). The setup was maintained within the Cage Incubator Enclosure (custom made by Okolab), where the temperature was maintained at 37 °C by a temperature controller (Airtherm-Atx; World Precision Instruments). Both the microscope and the camera were controlled by an open source microscopy software (MicroManager 1.4.19). Phase contrast images were acquired by the software's multidimensional acquisition feature, through which the motorized stage moved the fluidic chip to 36 different positions. Each position was imaged every 30 or 60 s depending on the particular experiment. Each experiment was 30 min, although the imaging could be continued longer if needed to provide insights on kill dynamics.

**Image Processing.** The images were processed for detection of each row in the raw image and cell traps and empty traps in each row, removing background and performing pole detection to obtain the cell pole detection in each frame of each position using an algorithm developed in MATLAB. Details of this algorithm are given in *SI Materials and Methods* and Fig. S7.

**Data Analysis.** For cell pole tracking, we used  $\mu$ Track (22). For growth rate calculation of individual cells, we applied a sliding window of data points (length) and fitted a linear function to the logarithm of them. The sliding window grows from 2 to 10 min in the beginning of the experiment and stays at 10 min afterward. We filtered some data based on fixed criteria to remove misidentified particles or cells that were dead from the beginning as well as the traps that were overly filled or left empty during the loading. Details of filters applied are given in *SI Materials and Methods*.

All raw data will be made available upon request for noncommercial interests. The ethical review committee in Uppsala has no objection to this study (reference no. 2017/051).

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