Chitosan films for microfluidic studies of single bacteria and perspectives for antibiotics susceptibility testing

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31 Abstract

32 Single cell microfluidics is powerful to study bacteria and determine their susceptibility to antibiotics treatment. Glass treatment by adhesive molecules is a potential solution to 33 immobilize bacterial cells and perform microscopy but traditional cationic polymers such as 34 35 poly-lysine deeply affect bacterial physiology. In this work, we chemically characterized a class 36 of chitosan polymers for their biocompatibility when adsorbed to glass. Chitosan chains of known length and composition allowed growth of *Escherichia coli* cells without any deleterious 37 38 effects on cell physiology. Combined with a machine-learning approach, this method could 39 measure the antibiotics susceptibility of a diversity of clinical strains in less than 1 hour and 40 with higher accuracy than current methods. Last, chitosan polymers also supported growth of 41 Klebsiella pneumoniae, another bacterial pathogen of clinical significance. The low cost of 42 chitosan slides and their simple implementation makes them highly versatile for research as 43 well as clinical use.

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45 **Introduction** 46

In recent years, microfluidics coupled with live-cell imaging have revolutionized
 bacteriology, testing directly the impact of rapid and controlled environmental transitions on
 cell physiology. With the advent of super-resolution microscopy, the bacterial cell can now be
 further explored at unprecedented resolution, tracking cellular processes one molecule at a time

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(1). The impact of these methods is not limited to basic research because single cell approaches
are unquestionably powerful at determining antimicrobial susceptibility (AST, Antimicrobial
Susceptibility Testing) in record time (2, 3).

However, a major technical bottleneck with the implementation of single cell approaches for super-resolution or AST, is the immobilization of bacterial cells. Agar surfaces have been widely used and support the growth of a wide range of bacterial species. However, this method has several limits:

- (i) Agar surfaces are not compatible with high-end microscopy (HEM) methods
 that require cells to adhere to glass, for example Total Internal Reflection
 Fluorescence Microscopy (TIRFM) and all single molecule microscopy
 techniques (PALM, STORM, STED).
 - (ii) Because the adhesion of bacterial cells to Agar surfaces is generally weak, these surfaces cannot be manipulated in aqueous environments and the experimental conditions are generally set by diffusion through the agar substrate. However, this approach does not allow rapid changes of the medium or injection of chemicals and thus the kinetics and precise dose-dependent effects are poorly controlled (3, 4).

69 Alternative methods have remedied these issues by growing bacteria immediately in contact 70 with a glass surface. Because most bacteria do not directly adhere to glass, immobilization 71 procedures are required, which include direct physical immobilization of the bacteria in micro 72 channels or glass functionalization by adhesive polymers. The use of micro-channels is 73 certainly compatible with HEM and it allows fast AST with high accuracy (2, 5). However, this 74 method requires expert handling, complex nanolithography to produce the channels and 75 extensive development to be used for the study of a given bacterial species. Alternatively, 76 bacterial adhesion on glass can be obtained by functionalizing a glass slide with adhesive 77 polymers/molecules. This approach can also be difficult because the polymer must be fully 78 biocompatible and the functionalization procedure and surface chemistry can be complex. 79 Indeed, although this approach has been widely used for eukaryotic cells, the choice for polymers biocompatible with bacteria is limited. Cationic polymers such as poly-lysine bind 80 81 glass surfaces effectively and promote adhesion of a wide range of bacterial species. However, 82 poly-lysine also generates cell envelope stress and has been shown to dissipate/diminish the membrane potential in several Gram negative of Gram positive species (e.g. Escherichia coli 83 84 or *Bacillus subtilis* (6-8)). For clinical microbiology applications, this issue is particularly 85 sensitive because changes in the membrane potential can directly affect antimicrobial 86 susceptibility (9) and thus produce false negative or even worst, false positive results in AST. Thus, there is a need in developing new functional polymers with neutral effects on bacterial 87 88 physiology for single cell AST studies.

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90 This work originated from the observation that chitosan polymers can support bacterial 91 adhesion and motility on surfaces (in the case of *Myxococcus xanthus* and *Bacillus subtilis* (1)). Herein, we investigated if chitosan-treated glass slides could also support bacterial growth when 92 93 inserted in commercial microfluidic chambers. Using a specific chitosan polymer (with a high 94 degree of acetylation) and a new controlled functionalization procedure, we showed that 95 Chitosan-Coated Slides (CCS) can support the growth of E. coli during multiple generations 96 without any effects on bacterial fitness. Using clinical E. coli strains obtained from intestinal 97 and urinary tract infections ((I/U)TI) of known antibiotics susceptibilities, we showed that CCS 98 allowed fast direct determination of AST. Last, CCS can be derived to promote growth of other so-called ESKAPE pathogens such as Klebsellia pneumoniae, which also raise significant 99 problems for antibiotics treatment (10). We conclude that chitosan-based functionalization 100

procedures are promising for their application in bacterial single cell studies for basic researchbut also potentially, in clinical contexts.

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104 **Results**

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106 Functionalizing glass slides with chitosan polymers

107 Chitosan is a linear polysaccharide composed of randomly distributed β -(1 \rightarrow 4)-linked Dglucosamine and N-acetyl-D-glucosamine units (Figure S1A). Its physicochemical properties 108 109 are highly dependent on its macromolecular parameters (i.e. average molar mass M_w , and 110 degree of acetvlation DA). A control of these parameters is needed to ensure robustness when 111 studying the physicochemical and biological behavior of chitosan polymers. Indeed, growth 112 and motility where not always reproducible when glass slides were coated with raw commercial 113 chitosan and this variability could be due to the poor chemical characterization of commercial stocks, which contain chains of variable DA, molar mass and statistical distribution of the acetyl 114

- 115 groups.
- 116 Consistent with this, size exclusion chromatography (SEC-MALLS/RI) analysis performed on
- 117 chitosan from a commercial source (Sigma-Aldrich, See Methods), revealed an important
- dispersity in polymer chains length (Polydispersity Index D = 2.65). It is essential to control
- the dispersity of chitosan chains because slight variations in molar mass and DA of chitosan polymers can be associated to a wide range of biological responses: cell adhesion, wound
- healing and even bacterial stasis and lysis (11, 12). As a general trend, it is mandatory to determine and control each molecular parameter in order to understand their impact on bacterial
- 123 physiology and to ensure reproducibility of our experiments.
- 124 To this aim, we first generated a large library of chitosan polymers with various DA and molar
- masses (13) (Chito-library). Different molar masses (M_w , 180 kg/mol and high M_w , 460 kg/mol)
- were obtained by selecting chitosan from different source (shrimp or squid). To control the acetylation levels, the polymer chains were re-acetylated *in vitro* to produce DAs of 1%, 10%,
- 128 15%, 25%, 35%, 45%, and 55% (14). Each polymer was characterized by SEC to control its
- molar mass and by ¹H NMR to measure its DA (Figure S1A, see Methods).
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131 Flat and homogeneous layers of polymer in the nanometer range (i.e. 15 nm < thickness < 150 132 nm) were obtained by Spin-coating of chitosan solutions with controlled concentration and pH (Figure 1A). Substrates were chosen to be either silicon wafers for physicochemical 133 characterization, or boro-silicate glass coverslips for bacterial single cell studies (Figure S1B, 134 135 no incidence of the substrate was noticed on the physicochemical characteristics of chitosan 136 layers). The thickness, uniformity, wettability and morphology of chitosan ultrathin films prepared from the chito-library were systematically examined by ellipsometry, tensiometry, 137 optical microscopy, profilometry or atomic force microscopy (Figure 1B). Whatever the 138 139 formulations studied, thickness and wettability of chitosan layers were highly reproducible (e.g. 140 23.3 ± 1.3 nm, and $37.8 \pm 1.2^{\circ}$, for chitosan formulation of DA 55%, [c] = 0.67%, $M_w = 180$ 141 kg/mol, with n = 10), with a Root Mean Square (RMS) roughness lower than 1 nm. The detailed information on the physicochemical properties of the chitosan thin films will be described in a 142 143 specialized dedicated publication.

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We thus successfully generated homogeneous CCS of known polymer molar mass, DA and thickness. By varying the chitosan macromolecular parameters and chitosan solution characteristics, more than 50 different chitosan coatings were thus prepared to be screened for their ability so support bacterial proliferation.

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151 Specific chitosan polymers promote adhesion and normal growth of *E. coli* cells

We next tested the ability of the various types of CCS to support the adhesion and ultimately growth of the main laboratory *E. coli* K12 strain. To perform this screening, we divided our CCS library in nine representative subclasses, based on source, DA and additional treatments (Table 1). Each CCS type was then mounted at the bottom of a microfluidic cassette and tested for *E. coli* adhesion and growth (see Methods).

157 We found that while LB-grown E. coli cells did not adhere to uncoated glass slides, they 158 adhered to all CCS types, showing that chitosan can indeed promote adhesion of E. coli. 159 However, while E. coli cells did generally proliferate on these surfaces, growth was frequently 160 abnormal, evidenced by cell filamentation and morphological aberrations (Figure S2A). 161 Nevertheless, one type of CCS obtained with chitosan polymers of DA 55%, M_w of 156 kDa and thickness of 32 nm supported normal growth (C5, Figure 2A, Table 1). To further 162 characterize this chitosan class, we tested 156 kDa polymers of varying DAs and found that 163 DAs >50% were required for biocompatibility (Table 1). In addition, formulation was important 164 because acid rinsing negatively impacted the biocompatibility of the procedure (Table 1). 165

We next characterized the ability of C5 to promote adhesion and growth in detail. *E. coli* K12formed mono-layered micro-colonies and could be monitored for up to 6 generations after

which the cells started growing above the focal plane defined by the glass slide. Expansion of the *E. coli* micro-colony in 3D could occur because tight adhesion of the monolayer forced the

- daughter cells to grow away from the immediate surface, which has been shown to act as drivingforce for bacterial colony and biofilm development (15). To test this possibility, we analyzed
- 172 *E. coli* cell adhesion to C5 by Reflection Interference Contrast Microscopy (RICM), a technique
- that allows imaging of intimate cell contacts with glass surfaces (16). RICM revealed that each

cell remained in close contact with the glass surface by adhering along their axis. Surface escape

- was due to steric constraints and vertical growth of bacteria adhered via their cell poles (Figure2B, Movie S2). In contrast, when we performed RICM on a CCS type that created abnormal
- cell torsions, it was apparent that the dividing cells only adhered via the cell poles, explaining
 cell detachment and the emergence of torsions (Figure S2B). Consistent with the RICM results,
- 179 *E. coli* cells remained attached to C5 event when subjected to shear stress of up to 12 dyn/cm^2 180 (which is comparable to shear stress generated in aorta (*17*), see Methods).

181 We next tested whether C5 created detectable stress on K12 E. coli growth. E. coli K12 cells 182 grew exponentially with a generation time similar to the generation of E. coli grown under agitation in liquid culture at room temperature (Figure 2C, C5 experiments were conducted at 183 25°C. C5 also supported growth of E. coli at 37°C but all described experiments were performed 184 185 at 25°C to avoid the use of a thermo-controller system). Cell morphology, measured by the 186 aspect ratio (length/width) remained stable over time, showing that it was not affected on C5 (Figure 2D). Last, to test whether C5 generates long term cellular defects, we allowed E. coli 187 cells to develop on C5 until they reached stationary phase and became quiescent for 3 days. 188 189 These cells resumed growth normally after fresh medium was injected, showing that long term 190 exposure to C5 does not affect cell viability (Figure S2C). We conclude that C5 is a well-191 adapted chitosan to grow E. coli K12 cells on glass surface in microfluidics chambers.

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194 CCS allow fast Antibiotics Susceptibility Testing (AST)

Beyond their obvious use in research applications, CCS could provide a fast and reliable tool for AST. For this, CCS should be significantly faster and at least as reliable as currently used methods. To test this, we incubated *E. coli* K12 on C5 and injected Ampicillin, which rapidly

198 resulted in the typical cell elongation and formation of a bulge in the septal zone that precludes

199 cell lysis (Figure 3A, Movie S3). The approximate time-to-death was ~120 min (Td), consistent

with the kinetics described in other single cell experiments (18). On C5, Ampicillin generatesthe same cellular defects as in other studies and could thus be used for AST.

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203 We next tested whether antibiotic susceptibility may be determined in less time than the measured Td (as detected by irreversible cell lysis). Indeed, although E. coli cells lyse after 204 2hrs, the action of ampicillin is first characterized by abnormal cell elongation (Figure 3A). 205 206 Thus, early detection of abnormal cell morphologies would provide a fast method to assess the 207 action of Ampicillin. To do this reliably and computationally, we designed a machine-learning 208 based morphometric method that discriminates abnormal cell morphologies from WT cell 209 morphologies and detects the effect of antibiotics at different treatment times (Figure S3A-C 210 and Methods). Briefly, following segmentation and determination of cell contours, this method 211 allows the direct counting of cells with normal morphologies and thus the determination of growth curves. This approach could readily determine growth curves of an E. coli strain isolated 212 from a urinary tract infection and treated with increasing doses of Ertapenem, a relatively large-213 spectrum Carbapenem standardly used at the hospital (UTI227, Figure 3B). Lethal Ertapenem 214 215 effects could be detected as early as 50 minutes after addition of the antibiotic with 95% 216 confidence (Figure 3B-3C). Thus, combined with our computational detection method, CCS, and here specifically C5, is a promising tool for fast AST. 217

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219 CCS can be used to measure the Minimal Inhibitory Concentration of clinical *E. coli*220 isolates

To test the potential clinical application of CCS more broadly, we next obtained a collection of 15 clinical isolates derived from Urinary Tract (UTIs, 14 isolates) and Intestinal Tract Infections (ITI,1 isolate) and tested their ability to grow on C5. We determined that 70% of the clinical strains adhered and grew normally on C5 but that this number could be improved to 85%, if the thickness of C5 were increased to 66 nm (Table1), showing that thickness is another important parameter to increase the application spectrum C5 to most *E. coli* clinical strains.

- Important parameter to increase the application spectrum C5 to most *E. con* clinical strains.
 In current clinical practice, the antibiotic susceptibility of a given bacterial strain is determined
 huita as called Minimum Inhibitary Concentrations (MIC), which corresponde to the lowest
- by its so-called Mimimum Inhibitory Concentrations (MIC), which corresponds to the lowest 228 antibiotic concentration that prevents growth. To test if MICs determined on C5 can be directly 229 230 compared to MICs determined by standard methods, we further selected two clinical strains of 231 known MICs (as determined by Vitek2, Biomérieux) for Mecillinam (UTI704 MIC=2) and Ertapenem (UTI227 MIC<0.5) and measured their MICs on C5, extracting growth rates with 232 our computational methods (Figure 3D). In both cases, the results showed remarkable 233 234 consistency with the Vitek method and in fact, the CCS method was more sensitive allowing to 235 determine that the UTI227 Ertapenem MIC is between 0.01 and 0.05 mg/ml (Figure 3D, Table 2). To further test the validity of the method, we tested the consistency of the measurements 236 237 over various range of Ertapenem concentrations for UTI227 and showed that its Mecillinam 238 MIC on C5 also matches the Vitek-determined MIC (Table 2). Further MIC measurements on 239 additional clinical strains UTI687 and UTI698 on Ofloxacine and Mecillinam, respectively also 240 showed good consistency with Vitek measures (Table 2). In conclusion, CCS appears a 241 promising tool to measure MICs rapidly and accurately in hospitals.
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244 CCS can be used to measure the Minimal Bactericidal Concentration of antibiotics

The MIC does not measure microbial death *per se* and thus it cannot distinguish bactericidal from bacteriostatic effects. This can be problematic for treatment, especially since it was discovered that antibiotic treatment can induce bacterial persistence, a seemingly dormant state that could be associated with chronic infections *(19)*. Using the Minimum Bactericidal Concentration (MBC), the lowest antibiotic concentration resulting in bacterial death, would in

general be more appropriate but it is a highly time-consuming procedure because it requires re-250 growing the bacteria after antibiotic treatment. However, as we show above, the CCS 251 technology allows direct observation of *E. coli* cell lysis in the presence of Ampicillin and is 252 253 therefore a potential tool to determine the MBC of an antibiotic directly and rapidly (Figure 254 3A). In addition, the microfluidic environment of CCS allows detection of cell death, for example using dyes such as Propidium Iodide (PI) that only bind the bacterial DNA if the 255 256 bacterial membrane is irreversibly altered. The use of PI can improve detection sensitivity, 257 especially if the detection method is automated. Indeed, addition of PI on E. coli treated-258 Ertapenem allowed cell death detection on C5, suggesting that this method could be used to 259 determine MBCs in clinical contexts (Figure 3E, Movie S4).

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262 CCS can be adapted to promote surface growth of *Klebsiella pneumoniae*

Next, we were interested in testing whether C5 could be useful to study other clinically-relevant
pathogens. In particular, and along with UTI *E. coli* strains, *K. pneumoniae* is a member of the
so-called ESKAPE pathogens, characterized by the high resistance of clinical strains to
antimicrobial compounds and thus a growing concern in hospital environments (10). Indeed, *K. pneumoniae* could readily grow on C5 (but at 66 nm thickness), with normal morphology and
generation time (~40 min, Figure 4A-B, Movie S5). Thus, C5 is a versatile substratum for
bacterial adhesion, and could be used in hospitals for AST of ESKAPE pathogens.

270 We next wondered if additional "Klebsiella-compatible" chitosans could be identified. As 271 discussed above, most tested chitosan polymers are not compatible with E. coli K12 and it could 272 be interesting to identify "species-specific" polymers for AST. To do this, we further screened 273 the Chito-library and successfully identified one additional CCS type, C11 (DA of 35 %, Mw 274 of 557 kDa and thickness of 101 nm) that also supported Klebsiella adhesion and growth 275 without detectable effect on bacterial fitness (Figure 4B, Figure S4). Importantly, C11 did not 276 support growth of E. coli. In total, the results suggest that CCS is adaptable to the study of multiple bacterial species and that depending on their chemical structure chitosan substrates 277 278 can either be derived to support adhesion and growth of multiple bacterial species or more 279 specifically, to grow a given bacterial species or even perhaps strain.

280281 Discussion

In this work, we report a new glass functionalization procedure that supports bacterial adhesion 282 and growth without any detectable physiological stress, contrarily to currently used 283 284 polycationic polymers such as Poly-lysine. This technique allows studies of bacteria at the single cell level in simple microfluidic devices without the need of complex lithography or 285 alternative physical immobilization techniques. Because the chemistry of the chitosan polymers 286 287 and glass functionalization procedures are well established, the method is robust and highly 288 reproducible. Moreover, CCS are long-lived and their integrity is not altered after storage of up 289 to 6 months. Thus, CCS are highly versatile and provide a viable alternative to other and often 290 more technically challenging microfluidic single cell approaches.

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292 Although we characterized one CCS type in details and showed its potential for studies of E. 293 coli and K. pneumoniae for basic and clinical purposes, we also show here that CCS can be 294 derived for the studies of multiple strains and species, in particular ESKAPE pathogens. We 295 also performed preliminary tests of the ability of C5 in promoting growth of a wide range of 296 Gram negative and Gram positive bacteria. In our hands, C5 supported growth of Vibrio 297 cholera, Myxococcus xanthus, Mycobacterium smegmatis, Pseudomonas aeruginosa (C5 also 298 supported *Pseudomonas* twitching motility) but cell adhesion for these species was arguably 299 not optimal. Nevertheless, CCS could be optimized for these species by testing different C5

thicknesses or alternatively, by isolating other CCS-types as we performed for *Klebsiellapneumoniae*.

The variable effects of chitosan between species and even within species is not too surprising 302 303 because the biological properties of chitosan can vary widely based on composition and formulation. For example, chitosan polymers of large size (> 550 kDa) and high degree of 304 acetylation (>50%) are known to exert bacteriostatic effects on some bacteria (11). In addition, 305 306 adhesion likely depends on the surface properties of the bacteria. In E. coli, phenotypic and 307 genotypic diversity is very wide (20) and thus it is possible that some isolates fail to adhere 308 (albeit a minority) because they have different surface properties (for example if they carry 309 particular LPS O-antigens). An interesting avenue for future developments will be to test 310 whether composite CCS made from several chitosan polymers increase the array of species and 311 strains that may be grown on a single type of slides.

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313 The applications of CCS in the field of bacterial cell biology are evident as such technology supports studies of any cellular processes, cell division, but also perhaps for studies of more 314 complex population structures such as micro-colonies, biofilms and communities. Using a 315 316 collection of *E. coli* strains, we typically observe that the bacteria first proliferate in two dimensions which we have shown by RICM occurs due to tight adhesion. The bacteria 317 eventually proliferate away from the surface when space becomes a limiting factor for 318 319 proliferation (Figure 2B). However, we also observed that some E. coli strains colonize the 320 entire surface in 2D and thus form a single layer biofilm (Figure S5, Movie S6). The formation 321 of E. coli micro-colonies on a surface has been shown to depend both on adhesion strength and 322 preferential adhesion of the polar regions (which we also observe here, Figure 2B, (21)). Thus, 323 it is likely that expanded micro-colonies are obtained depending on adhesion strength. Screening conditions that support biofilm formation for a particular strain could be achieved by 324 325 defining a compatible adhesion range, either by modulating the ionic strength of the medium 326 and/or changing the chitosan thickness, molar mass and DA.

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328 The search for rapid phenotypic assays to determine antibiotics susceptibility is now a global priority to save on the use of large spectrum antibiotics and limit the spread of multiple 329 330 antibiotics resistance in hospitals (22). In current clinical practice, AST is generally performed 331 using semi-automated methods that measure growth in bulk cultures in liquid (i.e. VITEK, (23)) or solid media. These methods only vield MICs estimate and the more accurate methods (i.e. 332 antibiotic gradients or E-tests (24)) are time-consuming and costly. Moreover, all of these 333 334 phenotypic antibiotic susceptibility testing require from 18 to 24 hours to provide an estimate 335 of antibiotic susceptibility. Single cell microscopy approaches are powerful alternatives because they measure MIC as well as MCBs directly, more precisely and sometimes in less 336 than 30 min, for example in microchannel chips (2, 25). This technology however suffers from 337 338 important drawbacks linked to sophisticated manipulation and high species-specific use, 339 making its generalization in clinical practice difficult. Also, this method precludes 340 morphometry analysis because the bacteria are maintained in channels that directly constrain their shape. Direct morphometry analysis for rapid AST has shown promising results on 341 342 bacteria embedded in agarose (3). However, in this case, the antibiotics were added indirectly 343 by diffusion through the agarose making it difficult to control the exact concentrations and potentially slowing their action. In this context, CCS could provide an interesting alternative as 344 345 we have shown that it can be applied reliably for two major ESKAPE pathogens and it combines 346 the advantages of both above approaches, allowing direct antibiotic injection and morphometric 347 analyses. The CCS method is more sensitive and ~10-20 times faster than traditional plate 348 assays (here 50 min). A machine-learning based computational approach appears promising to 349 measure MICs in automated fashion. The method still needs testing at higher throughput, but 350 the results establish a proof of principle that its application for MIC determination is feasible. In addition, one system that could exploit it directly, the so-called Accelerate Pheno System 351 (APS, Accelerate Diagnostics) is currently being implemented in hospitals (26, 27). Similar to 352 353 CCS, APS relies on surface immobilization of bacteria on glass slides in microfluidic channels. However, in absence of more adapted coating, the APS uses poly-lysine and Indium Tin Oxyde 354 (ITO) facilitated gel electro-filtration to immobilize bacteria (US Patent N°7341841B2). It is 355 356 therefore likely that this procedure perturbs the bacterial cell envelope, affecting the proton-357 motive force (6-8) and thus downstream, the accurate measurement of MICs. Indeed, lowering 358 the proton motive force can artificially result in increased antibiotic resistance for some classes 359 of antibiotics and thus generate false results (9). In the future, adapting CCS to support growth 360 of most clinical pathogens could make this technology an interesting tool for AST.

361

362 Material and Methods363

364 Materials

365 Chitosans with low degrees of acetylation (DA) and different molar masses (M_w) were purchased from Mahtani Co.ltd: a medium molar mass CS (CS₁₅₆: DA 1.0%; $M_w = 156.1$ 366 kg/mol, D = 1.78, batch 243)) and a high molar mass CS (CS₅₅₇: DA 2.4%; $M_w = 557.2$ kg/mol, 367 D = 1.39, batch 114). They were reacetylated to DA ranging from 1 to 80% using a procedure 368 369 previously described.(21) Acetic acid (AcOH), hydrogen peroxide (40% w/w), sulfuric acid 370 (96% w/w), hydrochloric acid (HCl, 37%), propan-1, 2-diol and ammonium hydroxide were 371 purchased from Sigma Aldrich. Sterile and non-pyrogenic water was purchased from Otec[®]. Silicon wafers (doped-P bore, orientation (100)) were purchased from Siltronix[®] and glass 372 coverslips (75 x 25 x 0.17 mm³ #1.5H D263 Schott glass) from Ibidi. 373

374

375 Chitosan preparation

376 CS was subjected to filtrations in order to remove insolubles and impurities before any use. CS 377 was first solubilized in an AcOH aqueous solution, followed by successive filtrations through 378 cellulose membrane (Millipore®) with pore sizes ranging from 3 μ m to 0.22 μ m. CS was then 379 precipitated with ammonium hydroxide and washed by centrifugation with deionized water 380 until a neutral pH was obtained. The purified CS was finally lyophilized and stored at room 381 temperature.

In order to investigate the effect of DA on the film properties, CS with various DA were 382 prepared by chemical modification using acetic anhydride, for both CS of different molar 383 384 masses (14). CS was first dissolved in an AcOH aqueous solution (1% w/w) overnight. A 385 mixture of acetic anhydride and 1,2-propanediol was then added dropwise in the CS solution 386 for at least 12 h under mechanical stirring. The amount of acetic anhydride added was calculated 387 according to the DA aimed. The final solution was finally washed and lyophilized in the same manner as after the filtration step. The DA of the different CS prepared was determined by ¹H 388 NMR (Bruker Advance III, 400 MHz). For CS₁₅₆, the DA obtained are: 9.0 %, 14.5 %, 25.6 %, 389 390 35.3 %, 41.9 % and 52.2 %. DAs close to those obtained for CS₁₅₆ were obtained for CS₅₅₇: 8.0 %, 12.2 %, 21.5 %, 34.0 %, 45.3 % and 52.6 %. 391

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393 Film preparation

Silicon substrates and glass coverslips were cleaned from organic pollution using a piranha bath (ILSO (ILSO $\frac{1}{2} \frac{1}{2} \frac{1}{2}$

- $(H_2SO_4/H_2O_2, 7/3 v/v)$ heated at 150 °C for 15 min, and then rinsed with deionized water
- 396 (resistivity of 18 M Ω .cm). They were then subject to ultra-sonication in deionized water for 15
- min and dried under a flux of clean air. The substrates (glass or silicon) were then placed into $\mathbb{R}^{\mathbb{R}}$
- a plasma cleaner (Harrick Plasma[®]) for 15 min in order to generate the silanol groups at the
- 399 surface for a better adsorption of CS polymer chains.

In the meantime, CS was solubilized overnight in a solution of deionized water (Otec[®]) with 400 AcOH, under magnetic stirring and at room temperature. The amount of acid added was 401 calculated in stoichiometry compared to amine groups available along the CS polymer chain. 402 403 CS solutions with different concentrations ranging from 0.3% to 1% for CS₅₅₇ and concentrations ranging from 0.5% to 2% for CS_{156} were investigated in this study. 404

The films were finally formed onto silicon substrate by spin-coating at 2000 rpm until the 405 406 solvent evaporates completely (5 min). After spin-coating, films were stored 24 h at room 407 temperature before being characterized (unless mentioned otherwise). Some of the films were finally rinsed in AcOH aqueous solution (pH 4) for 5 min so that only the adsorbed chains of 408 409 chitosan remain on the sample; the samples were then immersed in a water bath and finally 410 dried under a flux of clean air (thickness < 3 nm in all cases).

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412 Surface topography

AFM. The surface morphologies were carried out by atomic force microscopy (AFM) (CSI 413 Nano-observer). AFM probes with spring rate close to 40 N/m were purchased from Bruker. 414

415 The AFM images were processed using Gwyddion software.

416

417 Thickness measurement

The film thickness was measured on the silicon wafers using spectroscopic ellipsometry. On 418 419 glass coverslips, the measurements were carried out using profilometry on scratched films. The

consistency of the results obtained by ellipsometry or using profilometer profiles independently 420

421 of the substrate used for a given chitosan solution permitted to use the measurement by

422 ellipsometry as reference.

The ellipsometer (SOPRA GES-5E) was set at an incident angle of 70°, very close to the silicon 423

424 Brewster angle. At least three measurements were done on each film at different positions in

425 order to verify the film homogeneity. Data were then processed using WINELLI (Sopra-SA)

software. A Cauchy model was used to fit experimental data ($\cos \Delta$, tan Ψ), in the spectral range 426

427 of 2.0-4.5 eV, depending on fits and regression qualities, to evaluate the thickness. The UV 428 parameters A and B were respectively set to 1.53 and 0.002.

A mechanical profilometer (Veeco Instruments) equipped with a cantilever of 2.5 um in 429 430 diameter was used to measure film thickness on glass coverslips. For this purpose, the samples 431 were previously scratched by tweezer to locally remove CS film. Data analysis was performed

with VISION V4.10 software from Veeco Instruments. 432

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434 Wetting measurements

Contact angles were measured using a tensiometer (Easydrop, Kruss) kit out with a camera 435

- 436 connected to a computer equipped with a drop shape analysis software. To put down the liquids 437 drop on the surface, a Hamilton syringe of 1 mL and a needle of 0.5 mm of diameter were used.
- 438 "Static" measurements correspond to the angle determined 10 seconds after water drop deposition.
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441 Strains, Cell Cultures and Media preparation

Strains used were either lab strains (K12) or clinical strains obtained from the Laboratoire de 442 443 Biologie - Centre Hospitalier Martigues.

E. coli and K. Pneumoniae cells were grown in ion-adjusted Luria-Bertani (LB) medium until 444

- exponential phase (OD = 0.5 ± 0.1) and diluted in LB to an OD around 0.01. The LB media 445
- 446 was prepared using 10 g/L bacto-casitone (BD, 225930), 5 g/L NaCl (Biosciences, RC-093), 5
- 447 g/L bacto Yeast extract (BD, 212750) and osmosed water supplemented with 0.46 µg/L MgCl₂,
- 3.21 µg/L CaCl₂, 5.02 µg/L ZnCl₂ and 6.15µg/L KCl. The cell suspension was then directly 448

added to microfluidic channels. Loaded microfluidic chambers were centrifuged 3 min at 1000 rcf (Eppendorf centrifuge 5430R) to maximize cell adhesion.

451

452 Preparation of chitosan slides and microfluidic chambers

Microfluidic channels were prepared from commercially-available six channel systems (stickySlide VI 0.4, IBIDI) that were directly applied to the surface of chitosan-coated slides. The
dried chitosan was rehydrated by addition de-ionised MilliQ water for at least 5 min.

456 After centrifugation, the microfluidic channels were connected to a syringe and a pump 457 (Aladdin syringe Pump WPI). Remaining non-adherent cells were thus removed trough a rinse 458 step: 1.5 ml rinse with a 1.5ml/min flow followed by 1.5 ml with 5ml/min flow. The work flow 459 was set at 3ml/h. Adhesion strength was assessed by increasing the flow in the channel. The 460 shear stress was calculated by the following formula, given by IBIDI: $\tau = \eta \cdot 176.1 \cdot \Phi$ were τ is the shear stress (dyn/cm²), η the dynamical viscosity (dyn.s/cm²) and Φ the flow rate (ml/min). 461 462 In absence of data about LB dynamical viscosity, we hypothesize that it is close to cell culture medium which is around 0.0072 dyn.s/cm². On C5, adhered cells resisted shear forces above 463 12.3 dyn/cm², indicating that they were firmly adhered.

464 1 465

466 *Dyes, Antibiotics treatment and MIC determination*

467 Propidium iodide (PI) is used as a DNA stain that cannot cross the membrane of live cells, 468 making it useful to differentiate healthy cells from dead cells. *E. coli* cells were immobilized to 469 C5 chitosan on microfluidic chamber in presence or absence of antibiotics. Immediately before 470 acquisition, the channel was rinsed with LB supplemented with 3mg/L Ertapenem (Sigma 471 Aldrich) and $50\mu L/ml$ PI (Sigma Aldrich, P4170).

For MIC determination different channels were prepared simultaneously with the same cell
suspension. Antibiotics Ertapenem, Ampicillin (Sigma Aldrich), Mecillinam (Sigma Aldrich)
and Oxofloxacin (Sigma Aldrich) were prepared at different concentrations (one channel
contained only LB as a control) and added to each channel just before image acquisition (every
3 min for standard acquisition). The MIC was defined for the lowest antibiotic concentration
that induced cell death/stasis.

478

479 Microscope acquisition and Image manipulation

Images were acquired with a Nikon phase contrast microscope (TE2000) equipped with a
motorized stage, a Nikon perfect focus system and 100X objective lens. For technical
convenience, experiments were performed at 25°C, a condition that supported both *E. coli* and *K. pneumoniae* growth. Standard Image analysis were performed under MicrobeJ a Fiji-Plugin
developed for the analysis of bacteria (28).

485

486 Reflection Interference Contrast Microscopy (RICM)

487 RICM was performed with a Zeiss Observer inverted microscope (Carl Zeiss, Jena, Germany) 488 equipped with a Zeiss Neofluar 63/1.25 antiflex objective, a crossed-polarizers cube, and a 489 C7780 camera (Hamamatsu, Tokyo, Japan) with an adjustable field and aperture stops. The 490 source was an X-cite 120Q lamp (Exfo, Mississauga, Canada) coupled to a narrow bandpass 491 filter (λ =546nm+/-12 nm).

492

493 Image segmentation

- 494 Image segmentation procedures were developed in Python. In order to provide a streamlined
- analysis procedure, we used the parameter-free threshold setting algorithm "iso_data" from the
- scikit-image python package (29) to extract the contours of the bacterial cells.
- 497 For each contour, we then perform a singular value decomposition from the numpy library *(30)*
- 498 to retrieve aligned and centered contours for each bacteria. We use defect analysis (provided

- by the opency library) to detect the septum and split the contours. If the defects attributed to the septum are distant of less than $0.5 \,\mu\text{m}$ and their center is less than $0.3 \,\mu\text{m}$ from the cell center,
- 501 the contour is considered to be composed of two cells, and is therefore split.
- 502 From the detected and split contours, we then extract relevant morphometric data:
- 503 the contour area,
- the contour length or perimeter,
- 505 the longer of the min area rectangle,
- the width of the min area rectangle,
- the circularity defined as $4\pi A/\ell^2$. It is equal to 1 if, the contour is perfectly circular, lower than 1 otherwise,
- the inverse of the aspect ratio of the enclosing rectangle, (width/length), always lower than
 1,
- the ratio of the minimal rectangle area to the cell area, (which should be close to one for a wild-type rod-shaped cell).
- 513

514 Image annotation and training

- 515 In order to constitute a training-set to apply supervised machine learning, we developed a web-516 based dashboard based on plotly-dash toolset (http://plot.ly/dash). The annotation tool allows
- 517 classifying the detected contours in 5 categories: normal, divided, abnormal, dead and invalid.
- 518 We annotated 7 assays corresponding to 8300 contours.
- 519

520 **Outlier detection**

- From the annotated contours, those marked as "normal" were used to train a single class scalable vector machine classifier provided by the scikit-learn library *(31)* More precisely we fit a OneClassSVM object over 75% of the annotated data and use the remaining 25% over the above defined morphometric data. The trained classifier is then used on all the detected data to remove invalid contours from the count on each image.
- 526

527 Sensitivity criterion

- For each assay, the growth rate *G* is computed by performing a linear regression of the logarithmof the number of detected bacteria versus time.
- 530 531

$N(t) = N_0 2^{t/\delta_t} \Leftrightarrow \log_2 N(t) = \log_2 N_0 + t/\delta_t$

- 532 The reported error is the 95% confidence interval. We use the scipy.stats.theilslopes 533 method (32) to perform the linear regression. A given growth assay is considered to survive if 534 the growth rate of 0.2 h^-1 . This corresponds to a doubling time $\delta = ln(2)/G$ lower than 200 535 min. This cut off was chosen as it is longer than the microscopy acquisiton span (Figure S3D).
- 536

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- 629

630 Acknowledgements

- 631 This work was funded by a CNRS Prematuration grant "Speedybiotics" and a SATT-Sud Est
- Maturation grant (Antiobio-R) to TM, OT and GS. We thank Leon Espinosa for help with themicroscopy.
- 634

635 Disclosure of competing interests

- The chitosan polymer characterization, coating procedure and applications is being patented in
 "A film of chitosan and a device comprising the same deposited on a substrate and uses thereof"
 Priority European patent application: EP18305666 2 (30/05/2018)
- 638 Priority European patent application: EP18305666.2 (30/05/2018)639
- 640 Figure Legends
- 641

642 Figure 1. Functionalization of glass slides with Chitosan polymers

- 643 (a) Protocol for glass surface modification and characterization of chitosan layers (See Methods644 for details).
- 645 (b) Chemical characterization of Chitosan thin films. Thin films are characterized by wetting
- 646 measurements, morphology imaging (AFM) and their thickness was determined by 647 ellipsommetry (See Methods for details).
- 648

649 Associated Supplemental Figure S1.

- 650 (a) Procedure for chitosan purification and preparation (See Methods for details).
- (b) Photographs of a silicon wafer before and after surface modification. In this example the
- wafer was covered with a chitosan solution of concentration 0.67%, DA 25% and $M_w = 180$
- 653 kg/mol. The layer shows high homogeneity.
- 654

Figure 2. Growth of E. coli on selected C5 Chitosan slides.

- 656 (a) Growth of *E. coli* K12 on C5. Shown are snapshots separated by 54 min after growth 657 initiation (left panel). See associated Supplemental movie S1 for the full time-lapse. Scale bar 658 = $2 \mu m$.
- (b) Adhesion of *E. coli* on C5 as measured by Reflection Interference Contrast Microscopy
 (RICM). *E. coli* is shown by Nomarski (DIC, left) revealing the three-dimensional organization
 of the *E. coli* micro-colony and by RICM to reveal the adhesion sites (observed as dark areas,
- right). Note that the cells remain tightly adhered to the Chitosan surface even at the latest time
- points when the micro-colony clearly expands above the focal plane. White arrows point to
- areas where the cells remain adhered by the cell pole only, allowing them to grow away from the Chitosan surface. See associated Supplemental movie S2 for the full time-lapse. Scale bar $= 2 \mu m$.
- 667 (c) Growth of *E. coli* K12 on C5. Shown is an exponential fit of the number of cells as a function 668 of time.
- (d) Morphology of *E. coli* on C5 over time. The aspect ratio are determined from phase contrast
- images of adhered cells and correspond to the ratio between the lengths of the long axis and theshort axis of the cell.
- 672

673 Associated Supplemental Figure S2.

- 674 (a) Morphological aberrations on Chitosan. Shown is *E. coli* K12 growth on C8 (Table 1). Note 675 that the cells show abnormal twisted filaments that gradually detach over time. Scale bar = 2 676 μ m.
- 677 (b) RICM of *E. coli* on torsion-inducing chitosan. On C8, RICM reveals that E. coli K12 cells 678 are mostly attached by the cell poles, explaining their twisted shape due to the combined growth 679 and local adhesion points. Scale bar = $4 \mu m$.
- 680 (c) C5 shows no long-term toxicity. Shown are *E. coli* K12 cells that resume growth after being
- 681 left for three days in exhausted medium and addition of fresh medium. Cell growth resumes
- 682 normally. Scale bar = $8 \mu m$.
- 683

684 Figure 3. C5-CCS can be used for fast AST of E. coli clinical strains

- (a) Ampicillin treatment is effective on C5. Note the characteristic Ampicillin-induced
 morphological transitions, cell elongation and the formation of a septal lytic "bubble" that
 precludes cell death. See associated supplemental movie S3 for the full-time lapse.
- (b) Trained detection of Ertapenem effects on growth of *E. coli* clinical strains. Measured growth curves for strain UTI227 with varying concentrations of ETP. Fitted growth curves computed from the number of detected cells across time are color-coded with respect to ETP concentration. For each curve, the plot symbol is circular if the cells survive, and diamond
- 692 shaped if the cell population stalls or shrinks due to cell death.
- (c) Estimation of the minimal diagnostic time. We performed an estimation of the growth rate
 for varying time spans for all assays and determined for each time span the fraction of assays
 for which the response could be ascertained with a 95% confidence interval.
- 696 (d) Comparison of the MICs as measured on CCS with MICs obtained at the hospital. The
- 697 MIC is determined for growth rates ≤ 0 obtained at given antibiotics concentrations. Note that

the hospital (Vitek) and CCS-determined MICs for Mecillinam are similar for UTI704, but thatthe CCS method measures MICs as low 0.05 for UTI227 in the presence of Ertapenem.

(e) Detection of cell death by Propidium-Iodide (PI) staining. PI only stains the bacterial DNA
 of permeable dead cells, which fast and sensitive quantification of MBCs. See associated

supplemental movie S4 for a typical time lapse.

- 703
- 704
- 705

706 Associated Supplemental Figure S3.

707 (a) Cell contour detection of a dividing bacterium after imaging by 100X Phase Contrast708 microscopy.

- (b) Quantification of the extracted contour. The orange outline reveals the convex Hull of thedetected contour. The red and gray dots are convexity defects used to detect the septum. Both
- red dots are automatically assigned to the septum. Further quantifications were based on the
- ratio of the area corresponding to the bacterial contour to the area of the minimal rectangle
- r13 encompassing this contour (rectangular fill).
- (c) Detection training of abnormal (and thus antibiotic sensitive) cells. Shown is an outlier detection obtained with the Scikit-learn one class scalable vector machine from the annotated dataset. For clarity, we only display the data corresponding to two dimensions, circularity and rectangular fill (see Methods for other parameters). Blue symbols: classified as normal; red symbols: classified as abnormal. Overall, there is a 10% rate of false negatives (normal contours)
- 718 symbols: classified as abnormal. Overall, there is a 10% rate of faise negatives (normal contours 719 labeled as abnormal) in both the training and test sets. This performance induces a noise is the
- growth curves and globally results in a 10% uncertainty in the computed growth rate. This
- uncertainty (which could be reduced with enhanced segmentation procedures) does not
- significantly affect the accuracy of MIC measurements.
- 723

724 Figure 4. *Klebsiella pneumoniae* grows on CCS

- (a) Growth of *Klebsiella pneumoniae* on C5. Shown are snapshots separated by 30 min after
 growth initiation (left panel). See associated Supplemental movie S5 for the full time-lapse.
- 727 (b) Growth of *Klebsiella pneumoniae* on C5 and C11. Number of cells as function of time and
- 728 corresponding exponential fits are shown.729

730 Associated Supplemental Figure S4:

731 Growth of *Klebsiella pneumoniae* on C11. Shown are snapshots separated by 30 min after 732 growth initiation (left panel). Scale bar = $2 \mu m$.

734 Associated Supplemental Figure S5: Single layer colonization of C5 by *E. coli* clinical

strains. Shown is the monolayer development of UTI698. Time points are separated by 54 min. Scale bar = $2 \mu m$. See also associated movie S6

737

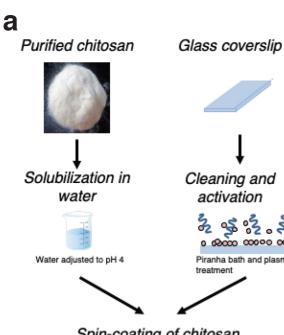
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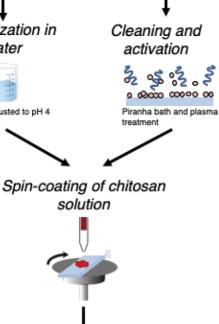
- 738
- 739 Tables
- 740

741 Table 1. chitosan types and Adhesion and proliferation of *E. coli* K12

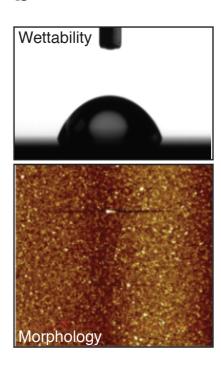
- 742
- 743 **Table 2. MIC determination in clinical strains**
- 744745 Supplemental movies:
- 746 Movie S1: Growth of *E. coli* K12 on C5
- 747 Movie S2: RICM of *E. coli* K12 on C5

- 748 Movie S3: *E. coli* K12 in the presence of Ampicillin
- 749 Movie S4: E. coli UTI 227 in the presence of Ertapenem and PI
- 750 Movie S5: K. Pneumoniae growth on C5
- 751 Movie S6: E. coli monolayers on C5

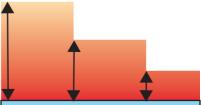




Physicochemical characterization

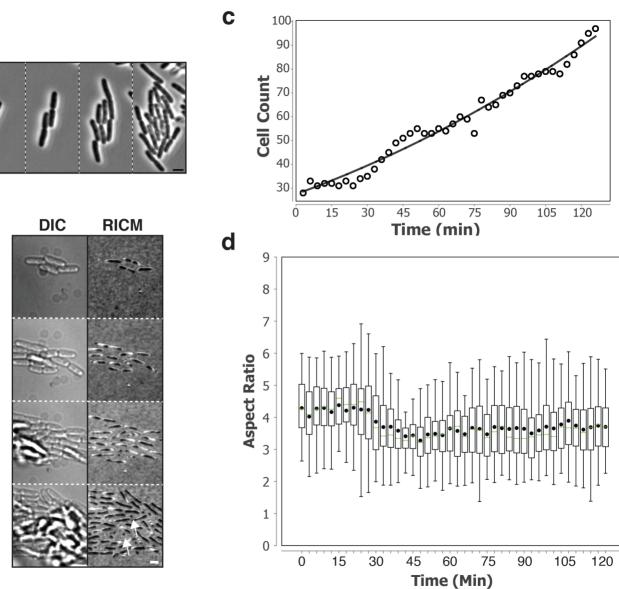


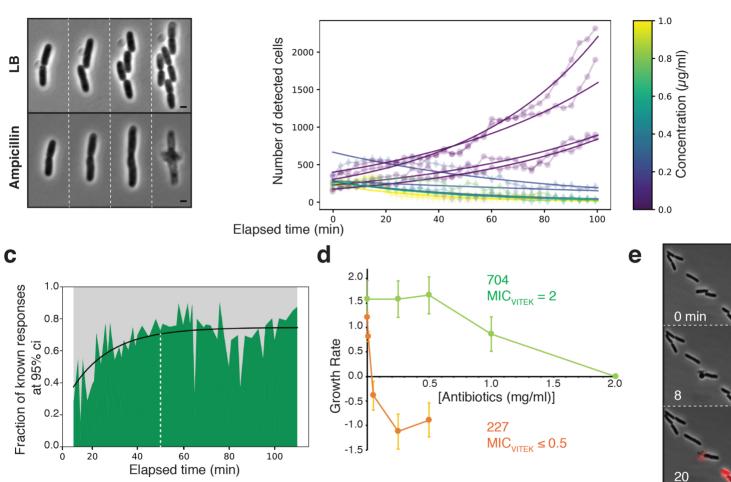
b



Thickness Determination

b

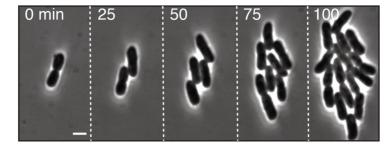




30

b

a



b

