

1 Article

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# Microfluidic cultivation and laser tweezers Raman

## 3 spectroscopy of *E. coli* under antibiotic stress

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15 **Abstract:** Analyzing the cells in various body fluids can greatly deepen the understanding of the  
16 mechanisms governing the cellular physiology. Because of the variability of physiological and  
17 metabolic states, it is important to be able to perform such studies on individual cells. Therefore, we  
18 developed an optofluidic system in which we precisely manipulated and monitored individual  
19 cells of *Escherichia coli*. We used laser tweezers Raman spectroscopy (LTRS) in a microchamber chip  
20 to manipulate and analyze individual *E. coli* cells. We subjected the cells to antibiotic cefotaxime,  
21 and we observed the changes by the time-lapse microscopy and Raman spectroscopy. We found  
22 observable changes in the cellular morphology (cell elongation) and in Raman spectra, which were  
23 consistent with other recently published observations. We tested the capabilities of the optofluidic  
24 system and found it to be a reliable and versatile solution for this class of microbiological  
25 experiments.26 **Keywords:** Raman microspectroscopy; optical tweezers; optofluidics; *E. coli*; antibiotics

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28 

## 1. Introduction

29 Raman spectroscopy combined with laser tweezers (LTRS), together with a microfluidic chip  
30 that allows compartmentalization of a few or individual cells and highly controlled exchange of the  
31 cell suspension fluids, can form the basis of a system for cell micromanipulation and sorting [1, 2].  
32 Raman spectroscopy is an analytical method that is based on detecting the vibrations of chemical  
33 bonds of molecules present in cells and nature in general, which makes it ideal for metabolomic  
34 analysis [3, 4] and fingerprinting [5, 6, 7]. After acquiring the spectrum from optically trapped cell,  
35 the data is analyzed and the cell can be subsequently sorted by an active micromanipulation with the  
36 optical trap [8, 9]. Properly implemented cell sorting is a completely non-invasive process and the  
37 sorted cells can be used for further cultivation and analysis [10, 11]. Furthermore, LTRS  
38 implemented in the microfluidic chip can serve to study the dynamics of the response of an  
39 individual cell to a controlled external stimulus or stress factor. This can be achieved by creating a  
40 concentration gradient and moving the studied cells into different compartments on the chip  
41 containing different antibiotic concentration and monitoring their response via Raman spectroscopy  
42 [12].43 Microfluidic chips with cell incubation microchambers fabricated in ISI were used for our  
44 experiments. The design was optimized based on the previous experiences from their use and the  
45 experimental needs. We generated a laminar flow of cultivation medium in the chip, we loaded the  
46 bacterial cells, and then we used optical tweezers to transport these cells into the microchambers.

47 During the experiment, the cells were placed in these dedicated incubation microchambers to  
48 prevent them from moving away with the cultivation medium flow and to allow undisturbed  
49 acquisition of time-lapse images or Raman spectra. After the antibiotic was introduced into the  
50 medium flow, within a few seconds it freely diffused into the microchambers. Therefore, the  
51 concentration of the applied stress factor (antibiotic) at the cell location and the time of exposure of  
52 the cells to the stimulus was precisely defined.

53

54 New methods to characterize the antibiotic susceptibility of bacterial pathogens in short times  
55 are of utmost importance. In times of rising antibiotic resistances the known resistance pattern of a  
56 pathogen helps the treating physician to prescribe the right antibiotic therapy in time. Established  
57 antibiotic susceptibility testing in the clinical routine is based on time-consuming cultivation and the  
58 result is usually not obtained before one or sometimes even after two days. Emerging alternative  
59 methods, such as new methods based on polymerase chain reaction (PCR) are much faster, but also  
60 very costly. Raman spectroscopy as a label-free and non-invasive method holds high potential to  
61 advance fast antibiotic susceptibility testing. It was already shown that successful antibiotic-bacteria  
62 interaction can be probed after half an hour only [13] which can be utilized in a fast antibiotic  
63 susceptibility testing within only 3.5 hours [14, 15]. Furthermore, it can also be used to quantitatively  
64 determine the minimal inhibitory concentration [16].

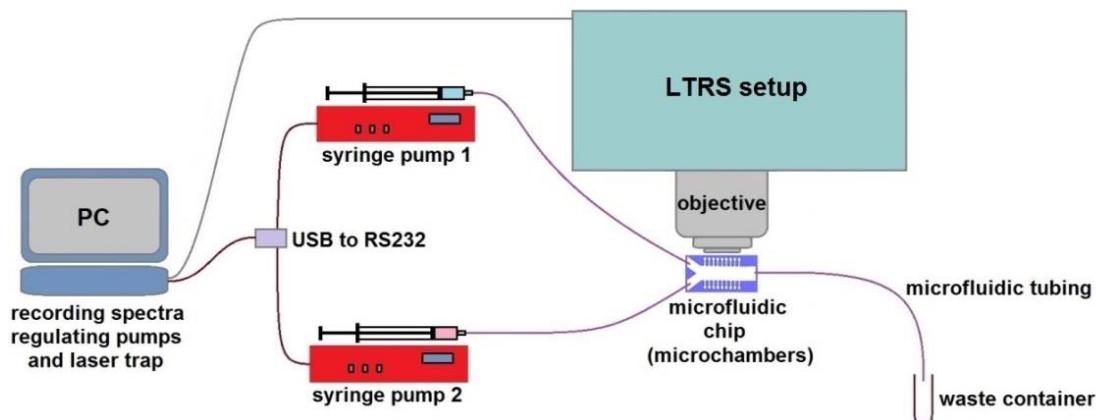
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66 The ultimate application of this technology to body fluids requires advanced microfluidic  
67 technology. Different approaches were already tested and implemented into a microfluidic device.  
68 Dielectrophoresis [17, 14] as well as centrifugal force [18] could successfully be applied to enrich the  
69 bacteria from urine samples. LTRS systems combined with microfluidic techniques offer  
70 furthermore the potential different to selectively remove cells from body liquids which are not  
71 targeted for analysis. We have developed several solutions in the area combining lasers and  
72 microfluidic environment [19, 20]. The chamber design was found to be quite successful for optical  
73 trapping experiments involving yeast cells [19] and currently we use it for experiments with *E. coli*.  
74 We aim to effectively combine microfluidics with our expertise in Raman analysis of bacteria and  
75 cells in general [21, 22, 23, 24, 25, 26, 27].

## 76 2. Materials and Methods

### 77 2.1. Optofluidic system

78 The layout of our specialized system for LTRS in microfluidic chip with microchambers is  
79 schematically depicted in Figure 1. We used it in combination with computer programmable syringe  
80 pumps (1-5 pumping units according to needs) which supply different liquids into the microfluidic  
81 micro-chamber chip, such as different media, buffers, antibiotics solutions, inoculum, etc. The  
82 microfluidic part of the system consisted of syringe pumps (NE1001, New Era Pump Systems, Inc.,  
83 Farmingdale, NY, USA), 1 mL glass syringes (Hamilton, Bonaduz, Switzerland), luer-lock  
84 connectors (IDEX Health & Science LLC, Oak Harbor, WA, USA), and microfluidic tubing from the  
85 same manufacturer (PEEK, internal diameter 360  $\mu$ m), which connected the chip to the syringe on  
86 one end of the main channel and to a waste container on the opposite end. In all the experiments,  
87 flow rate of the cultivation medium was set to 100  $\mu$ L/h.

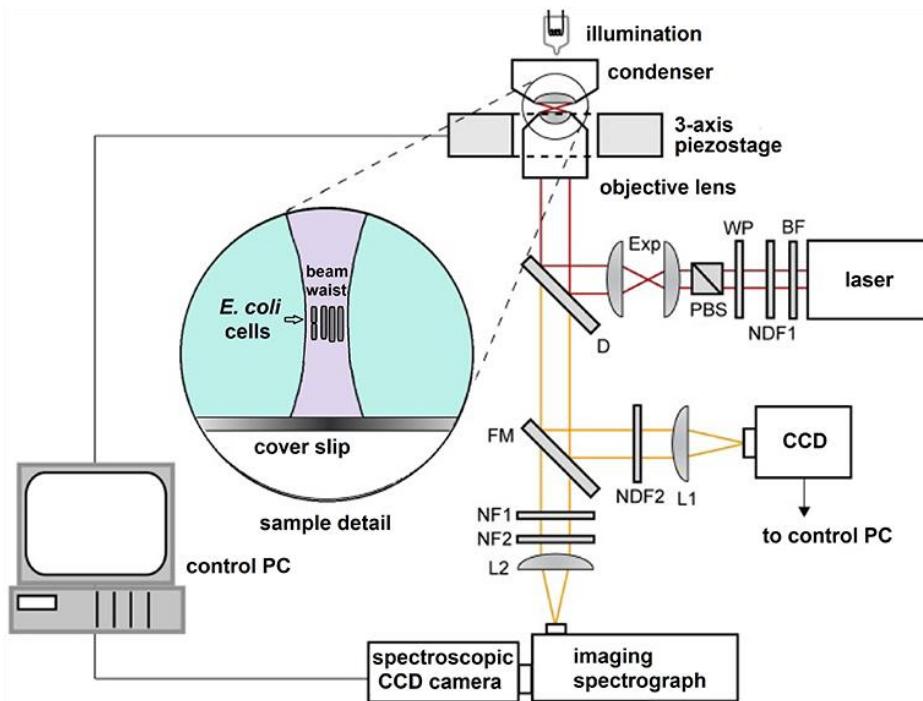


88

89 **Figure 1.** An optofluidic system for studying of individual living bacteria by laser trapping – Raman  
 90 spectroscopy (LTRS) in microfluidic environment. The microfluidic chip with microchambers, under  
 91 the microscope objective of the LTRS system, is interconnected with the syringe pumps that supply  
 92 the cultivation medium and the tested antibiotic solution. The pumps and the LTRS system are  
 93 regulated from dedicated software on a PC.

94 **2.2. LTRS system**

95 Main element of our optofluidic setup is the homemade laser tweezers – Raman spectroscopy  
 96 (LTRS) system. This system was a modified version of the setup used by Bernatová *et al.* [24]. The  
 97 schematic diagram of the LTRS setup is on Figure 2. It combines a Raman microspectrometer with  
 98 optical tweezers [28, 29] providing spatial confinement of individual bacterial cells during Raman  
 99 spectrum acquisition. The same laser beam is used for optical trapping and Raman spectroscopy.  
 100 The output beam from a laser (output power ~0.5W,  $\lambda = 785$  nm, Sacher Lasertechnik GmbH,  
 101 Marburg, Germany) was delivered to the setup by an optical fiber and its diameter was expanded 3×  
 102 by an external telescope (not shown in Figure 2.). From the telescope the beam passed through a  
 103 bandpass filter BF (transmission bandwidth 3 nm centered on 785 nm; MaxLine LL01-785, Semrock,  
 104 Rochester, NY, USA) to eliminate unwanted laser wavelengths. The power of the laser beam for  
 105 Raman spectroscopy was roughly adjusted by a neutral density filter NDF1 and fine setting was  
 106 done by a combination of a  $\lambda/2$  wave plate WP and a polarizing beam splitter PBS. Beam diameter  
 107 was further enlarged 2× by beam expander Exp. The laser beam was coupled to the microscope  
 108 frame via a dichroic mirror D (LPD01-785RS, Semrock) and focused on the specimen with a  
 109 water-immersion objective lens (UPLSAPO 60×, NA 1.20, Olympus, Tokyo, Japan). The maximal  
 110 available laser power at the specimen plane was approximately 150 mW. The objective was mounted  
 111 on a custom-made aluminium frame that also provided a stable support for the sample illumination  
 112 path and 3-axis piezo-driven stage (P-517.3CL, Physik Instrumente, Karlsruhe, Germany) for  
 113 positioning the sample relative to the beam focus. The Raman scattered light from the trapped  
 114 microorganism was collected by the same water-immersion objective, focused by a lens L2 on the  
 115 entrance slit of an imaging spectrograph (focal length 300 mm, f/3.9, 600 gr/mm diffraction grating,  
 116 SpectraPro 2300i, PI Acton, Acton, MA, USA), imaged on the chip of a high-sensitivity  
 117 liquid-nitrogen-cooled spectroscopic CCD camera (Spec-10:100BR/LN, Princeton Instruments,  
 118 Acton, MA, USA), and recorded using the camera control software (WinSpec, Acton, MA, USA).  
 119 Rayleigh scattered light at the laser wavelength was blocked by two edge filters NF1 (ZX000626,  
 120 Iridian, Ottawa, Canada) and NF2 (LP02-785RS, Semrock) and did not enter the spectrograph.  
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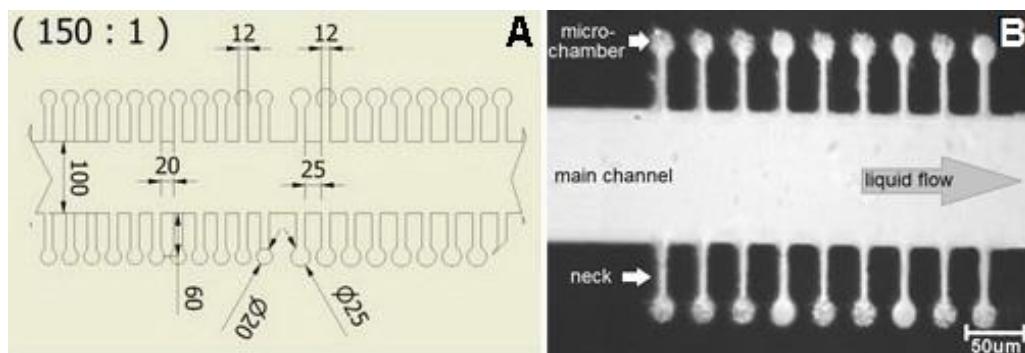
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123 **Figure 2.** Schematic diagram of the LTRS setup where the same laser beam is used for optical  
 124 trapping and Raman analysis. BF—band pass filter, D—dichroic mirror, Exp—beam expander,  
 125 FM—flipping mirror, L1,2—lenses, NDF1,2—neutral density filters, NF1,2—edge filters, PBS—polarizing  
 126 beam splitter, WP—lambda-half wave plate. Inset shows the detail of optically trapped bacteria near  
 127 the focus of the laser beam. See details in the main text.

128 *2.3. Microfluidic chips*

129 Crucial element of the optofluidic system is the microfluidic chip. Our microfluidic chips were  
 130 fabricated from poly(dimethyl)siloxane (PDMS) by conventional soft lithography, using master  
 131 stamps based on negative SU-8 epoxy photoresist deposited on a silicon substrate [30, 19]. In brief,  
 132 SU-8 was spin-coated on the silicon wafer, illuminated by a UV lamp through a mask, and  
 133 developed. The masks for photolithographic patterning of SU-8 were fabricated by ink-jet printing  
 134 on a transparent foil by a specialized company (Gatema, Brno, Czech Republic). PDMS mixture  
 135 (base to curing agent ratio of 10:1) was then poured into a mold formed by the SU-8 master stamp on  
 136 Si wafer at the bottom and a square frame machined from polycarbonate. After curing, the resultant  
 137 PDMS device was peeled off from the mold and attached to a glass slide using standard oxygen  
 138 plasma treatment.

139 The layout of microfluidic chips used in the experiments was previously employed [19] and is  
 140 apparent from Figure 3. Individual sample chambers of cylindrical shape (diameter 20  $\mu$ m or 25  $\mu$ m)  
 141 were connected to the wide main microfluidic channel (width 100  $\mu$ m) by side channels of width 12  
 142  $\mu$ m and length 60  $\mu$ m. Height of all chambers and channels in the chip was 20  $\mu$ m. Such  
 143 configuration ensured that the cells could not escape easily from the chambers only due to their  
 144 diffusion. On the other hand, the length of the side channels was sufficiently short to permit  
 145 diffusion-mediated replenishment of nutrients in the chambers during the course of the experiment.  
 146



147

148 **Figure 3.** Microfluidic chamber chip used for *E. coli* cultivation, Raman spectroscopy and optical  
 149 trapping experiments. A: A detail of the central part of the chip (dimensions in  $\mu\text{m}$ ); B: A microscope  
 150 image of individual micro-chambers in the chip and the adjacent main channel. The main channel in  
 151 the center is connected with narrow necks to the microchambers. *E. coli* cells are present in most of  
 152 the chambers, they appear dark and dot- or rod-shaped, depending on their positions. The main  
 153 channel delivers fresh culture medium to the cells in the chambers. The nutrients from the medium  
 154 and the products of bacterial metabolism diffuse through the neck in and out of the microchamber.

#### 155 2.4. Bacterial samples: Strain and growth condition

156 In this study the patient isolate *E. coli* 683 was used. This strain originated from the blood of a  
 157 sepsis patient and is part of the strain collection at the PathogenBiobank at the Institute of Medical  
 158 Microbiology and the Center for Sepsis Control and Care of Jena University Hospital. Casein soya  
 159 (CASO) medium (Sigma-Aldrich, sterilized by autoclaving for 15 min at 120 °C) was used for  
 160 cultivation. A sample of bacteria was cultivated on a CASO agar plate, then transferred to liquid  
 161 medium and incubated with shaking at 37 °C for 60 min before injection into the chip or off-chip  
 162 cultivation with cefotaxime (2 mg/L in CASO medium). The cell count of the injected culture was in  
 163 the order of  $10^6$  cells/mL. Small variations in the cell count of the injected culture had no influence on  
 164 the experiment.

#### 165 2.5. Optical trapping procedure

166 The procedure for optical trapping experiments with bacterial cells, similar to our previous  
 167 experiments [19, 31] was as follows. First, the cell culture suspended in the CASO medium was  
 168 introduced into the main microfluidic channel. Subsequently, all cells studied in a single  
 169 experimental run were placed one-by-one into adjacent micro-chambers using low-power optical  
 170 tweezers. In order to minimize the impact of optical trapping on the cells, we adjusted the laser  
 171 power near the minimal effective trapping power (approx. 10 mW). In addition, this initial optical  
 172 manipulation was carried out as quickly as possible (in less than 10 s). All analyzed cells were well  
 173 isolated from the bulk of the cell culture.

#### 174 2.6. LTRS protocol with Raman characterization with 785 nm excitation

175 *E. coli* cells were cultivated for 2 hours with shaking at 37°C in CASO broth with (+) and without  
 176 (-) 2 mg/L cefotaxime added to the medium. The cells were centrifuged for 4 min at 5000× g,  
 177 supernatant discarded, and the pellet washed with 1ml of cold PBS three times before the LTRS  
 178 measurement in order to remove any interfering Raman signal from the cultivation medium. Both  
 179 the optical trapping and Raman excitation was realized with 785 nm laser beam. Acquisition was 15  
 180 accumulations of 15 s integrations (225s total integration time per sample). Laser tweezers Raman  
 181 spectroscopy (LTRS) from *E. coli* cells was performed on max. 5 trapped cells for a single Raman  
 182 measurement. The assessment of the cell number was based on the size of the Airy disk (800 nm).  
 183 The spectra were normalized at 1004  $\text{cm}^{-1}$  (phenylalanine). The cells were loaded into a  
 184 microchamber and the specimen was placed on the piezo-stage of the LTRS system. The cells were  
 185 optically trapped approximately 20  $\mu\text{m}$  above the glass-liquid interface and spectrographed. The full  
 186 axial extent (depth) z of the excitation region was calculated to be approximately 4  $\mu\text{m}$ . This value is

187 comparable with the diffraction limit expected for focusing  $\lambda = 785$  nm light with an NA = 1.2  
 188 microscope objective in water. The full lateral extent (width) of the excitation region therefore  
 189 reaches the diffraction-limited value  $\Delta x = 1.22\lambda/NA \sim 0.8$   $\mu\text{m}$ . Considering that the bacterial cells are  
 190 on the same order of magnitude in diameter, we assume that only a few cells (from 1 to about 5) are  
 191 trapped and analyzed in the trapping region of 0.8  $\mu\text{m}$  [24]. The cells were observed by a standard  
 192 CCD camera through the flipping mirror FM (Fig. 1). During the acquisition of the Raman spectrum,  
 193 the flipping mirror FM was flipped down and the sample illumination was switched off.

194 *2.7. Raman spectroscopic characterization of *E. coli* in the bulk with 532nm excitation*

195 Additional Raman spectroscopic measurements without optical trapping were realized with  
 196 Renishaw In Via Raman microspectrometer with excitation at 532 nm, 100% power (approx. 150 mW  
 197 at the sample plane), 20 $\times$  objective and 30 accumulations of 1s for each spectrum. Cells of *E. coli* 683  
 198 were prepared as in section 2.6. The cell pellet was used to record bulk Raman spectra which served  
 199 as a reference to the LTRS experiment.

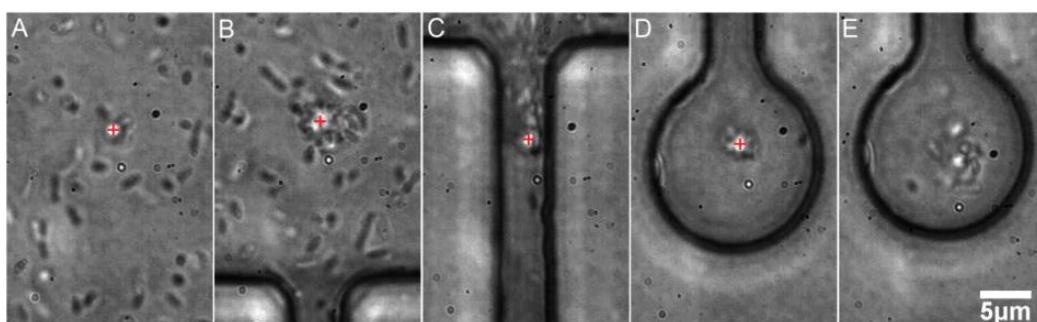
200 *2.8. Processing and analysis of Raman spectral data*

201 In order to extract quantitative information from the acquired spectra which contain  
 202 fluorescence along with the Raman signal, we adopted the high-pass signal filter (Rolling Circle  
 203 Filter–RCF) [32] to separate narrow Raman spectral peaks from the wide spectral background. With  
 204 an appropriate choice of the filter parameters (filter width and number of filter passes) the  
 205 background can be effectively removed with no significant distortion of the signal peaks. We kept  
 206 the same filter parameters for all the measurements presented in this paper. Principal component  
 207 analysis (PCA) was used for analysis of the obtained Raman spectra. The PCA analysis and RCF  
 208 were both realized via a homebuilt Raman analysis toolkit based on Matlab (MathWorks, Natick,  
 209 MA, USA).

210 **3. Results and discussion**

211 *3.1. Optical trapping in microfluidic environment*

212 We transported the bacterial cells with optical tweezers into the chambers, see Figure 4.  
 213 Effectiveness of single particle micromanipulation depended on the concentration of the particles in  
 214 the channel. Optimal single cell micromanipulation was effective only in highly diluted cell  
 215 suspensions, see Figure 4 and Figure 5.

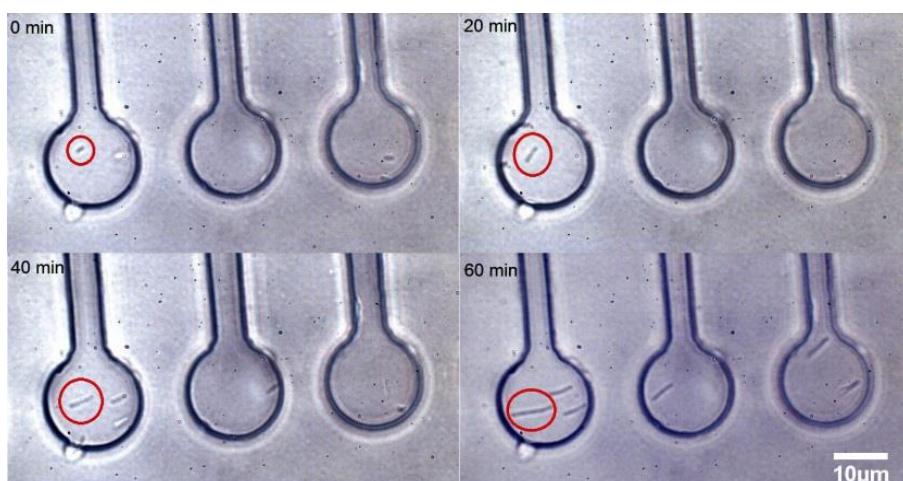


217  
 218 **Figure 4.** Demonstration of optical trapping and transport of multiple *E. coli* cells from the main  
 219 microfluidic channel into the microchamber. The position of optical trap is visible as a bright spot  
 220 near the centers of the images A-D, and it is also marked by a red plus sign for clarity. A: The optical  
 221 trap is switched on and a few bacteria are trapped almost immediately. B: The microscope table is  
 222 operated so that the optical trap is moved towards the neck, dragging with it a swarm of bacterial  
 223 cells. C: The optical trap passes through the narrow neck, losing some of the trapped cells in the  
 224 process. D: The optical trap is in the microchamber and it contains several cells. E: The optical trap is  
 225 switched off and the cells disperse in the chamber. It is possible to regulate the amount of trapped

226 bacteria by a proper dilution of the culture in the main channel. We were able to easily load  
227 individual bacteria into separate chambers, see Figure 5.

228 *3.2. Time lapse observation of E. coli growth in microchambers under antibiotic stress*

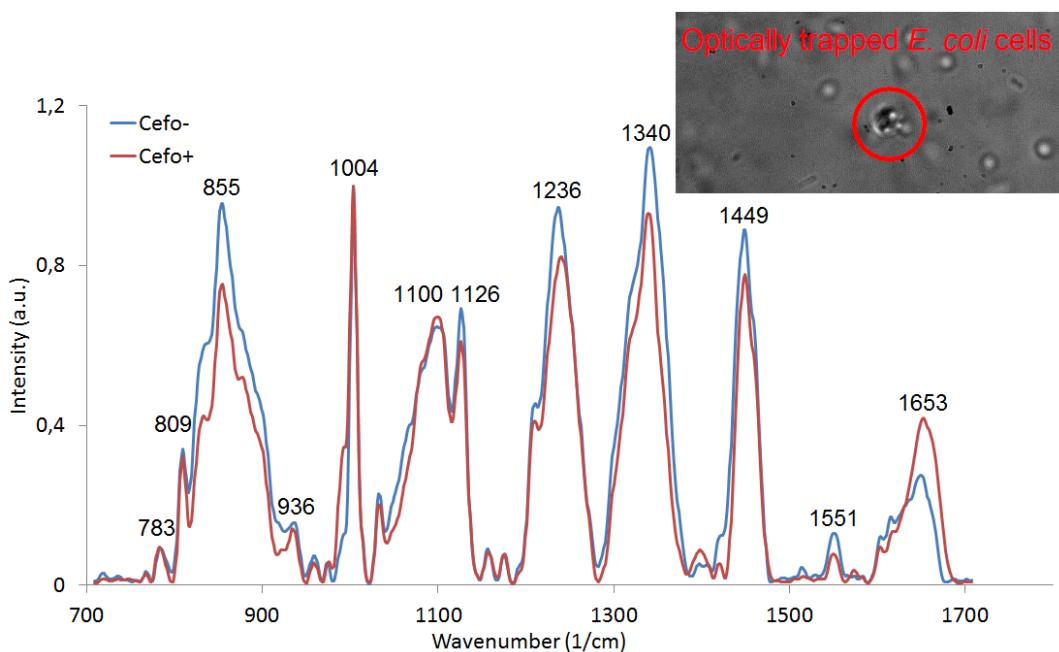
229 The microchamber chip design was used for time-lapse visual and spectroscopic observations  
230 of individual cells, in a similar manner as in our previous experiments [19], see Figure 5. The cells  
231 were loaded in the microfluidic chambers and the chip was perfused with CASO broth containing 2  
232 mg/L cefotaxime. The cells have elongated about 5 times during the 60 minutes of microfluidic  
233 cultivation. This phenomenon was observed previously [33]. Some cephalosporin antibiotics exhibit  
234 this effect in certain range of concentrations since they impair the process of cell division in the  
235 sensitive cells [33].  
236



237  
238 **Figure 5.** A time-lapse sequence of growing *E. coli* cells in microchambers in presence of 2 mg/L  
239 cefotaxime in CASO medium introduced by a syringe pump into the CASO medium running  
240 through the microfluidic chip. Red circle shows an individual bacterium growing over time. The  
241 time of cultivation in minutes is given for each quadrant in the top left corner. These bacterial cells  
242 were individually loaded into the chambers by optical tweezers. The cells became progressively  
243 longer over time in response to the cefotaxime treatment. The red circled bacterium has elongated  
244 about 5 times during the 60 minutes of microfluidic cultivation. Scale bar: 10  $\mu$ m.

245 *3.3. Experiments with LTRS of E. coli cells with 785 nm wavelength for trapping and Raman excitation*

246 We collected Raman spectra of the optically trapped *E. coli* cultivated for 2 hours with shaking  
247 at 37 °C in CASO broth with (+) and without (-) 2 mg/L cefotaxime added to the medium, see Figure  
248 6. The peaks at 855, 1126, 1236, 1340, 1449, and 1551  $\text{cm}^{-1}$  decreased with exposition to cefotaxime,  
249 while the peaks at 1100, and 1653  $\text{cm}^{-1}$  increased with cefotaxime present. We identified all the major  
250 peaks and compared their wavenumbers to a reference [11], see table 1. We tried to discriminate  
251 between the (+) and (-) group with the PCA method. The PCA from the spectra of *E. coli* presented on  
252 Figure 6 is depicted on Figure 7. The difference between the (+) and (-) group was highly statistically  
253 significant. These data cannot be directly compared with the Raman measurements of *E. coli* at 532  
254 nm, since the relative peak intensities are rather different with the two excitation wavelengths.  
255

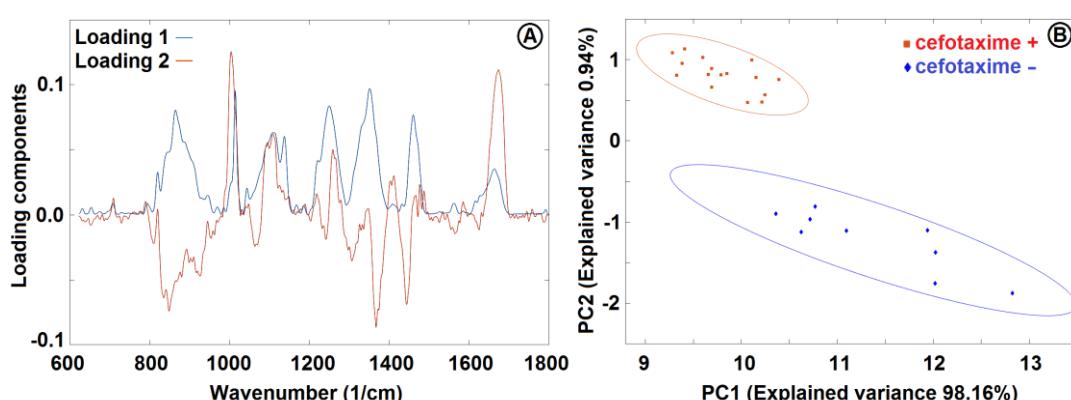


256  
257 **Figure 6.** Raman spectra of optically trapped *E. coli* cells cultivated with (+) and without (-)  
258 cefotaxime added to the medium. Each spectrum was averaged from 16 (+) and 9 (-) spectra. The  
259 spectra show several peaks typical for bacteria, all the major peaks were identified, see Table 1. The  
260 inset shows a bright field image of the trapped bacteria prepared for spectroscopic measurement.  
261 The red circle defines the optical trap location.

262 **Table 1.** Raman peaks of *E. coli* cells and their assignments.

Wavenumber (1/cm) <sup>1</sup>	Assignment	Wavenumber (1/cm)	Assignment
728 (719, 723)	Adenine	1095 (1100, 1094)	DNA: OPO-
783 (783, 783)	Nucleic acids (C, T)	1126 (1126, 1126)	C-N, C, T
813 (809, 810)	Tyrosine	1257 (1236, 1244)	Amide III
857 (855, 853)	Tyrosine	1340 (1340, 1337)	Nucleic acids (A, G)
936 (936, 934)	DNA backbone	1453 (1449, 1454)	C-H <sub>2</sub> def., lipids
1004 (1004, 1001)	Phenylalanine	1660 (1653, 1655)	Amide I

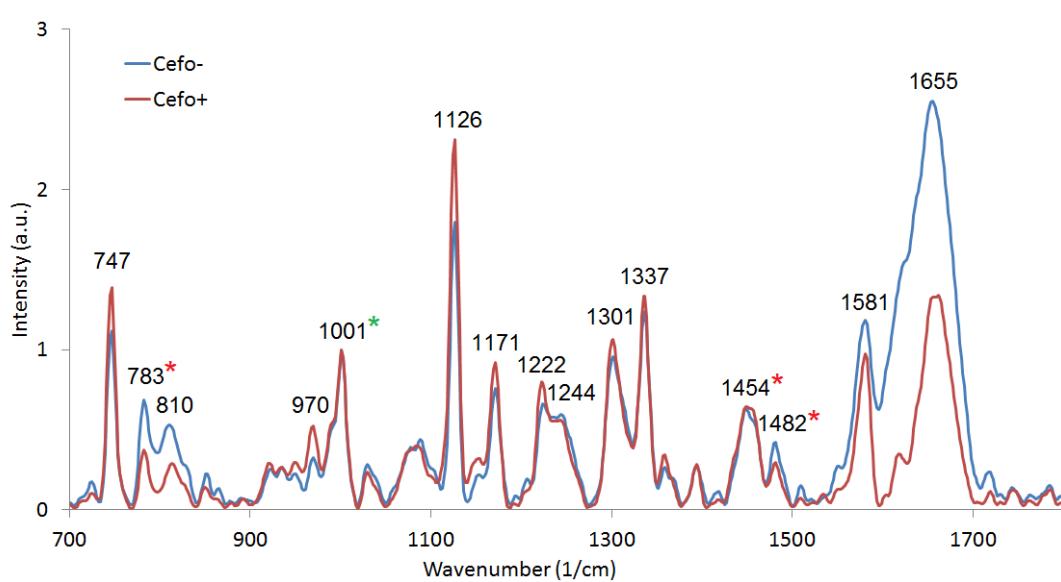
263 <sup>1</sup> Wavenumbers from [11] (633 nm excitation) are presented first (black), the numbers in bracket  
264 represent our measurements taken at 785 nm (red) and 532 nm (green) excitation wavelength.  
265



266  
267 **Figure 7.** PCA loadings (A) and PCA analysis (B) of *E. coli* cultivated in CASO broth with and  
268 without 2 mg/L cefotaxime added to the medium. See Figure 6 for the Raman spectra and section 2.6  
269 for sample treatment details. PC1 and PC2 were used for discrimination between the cells with (+)  
270 and without (-) cefotaxime. The ellipsoids represent 95% probability level.

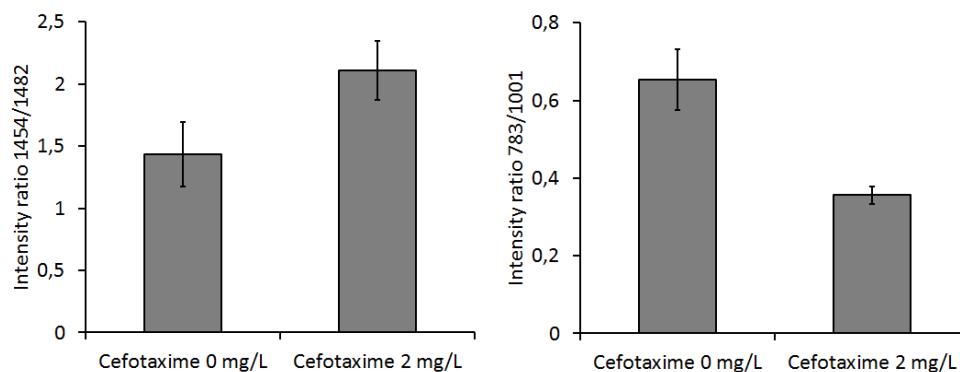
271 3.4. Raman microspectroscopy of *E. coli* cells with 532 nm excitation

272 We used commercial Raman microspectrometer Renishaw In Via to obtain spectra from *E. coli*  
 273 cells cultivated in CASO broth with (+) and without (-) cefotaxime, with excitation wavelength 532  
 274 nm, see Figure 8. We identified the dominant peaks, see Table 1. The spectrum of pure *E. coli*  
 275 samples includes the peaks around  $1458\text{ cm}^{-1}$  and  $1485\text{ cm}^{-1}$  (in our case this was precisely  $1454\text{ cm}^{-1}$   
 276 and  $1482\text{ cm}^{-1}$ ), which were identified by Kirchhoff et al. [16] as a promising indicator of drug  
 277 induced changes in *E. coli*. We can see that our results agree with these findings: the  $1482\text{ cm}^{-1}$  peak  
 278 intensity tends to decrease with the presence of cefotaxime relative to the  $1454\text{ cm}^{-1}$  peak.  
 279 Additionally, we have identified in our data and those of Kirchhoff et al. [16] that peak intensity at  
 280  $783\text{ cm}^{-1}$  invariably decreased in the presence of the antibiotic relatively to the  $1001\text{ cm}^{-1}$  signal of  
 281 phenylalanine. The bar graphs representing the ratios of these peaks are depicted in Figure 9. We  
 282 further supported our findings with PCA analysis, see Figure 10. PCA analysis was capable of  
 283 resolving the cells grown with (+) and without (-) cefotaxime with high reliability.  
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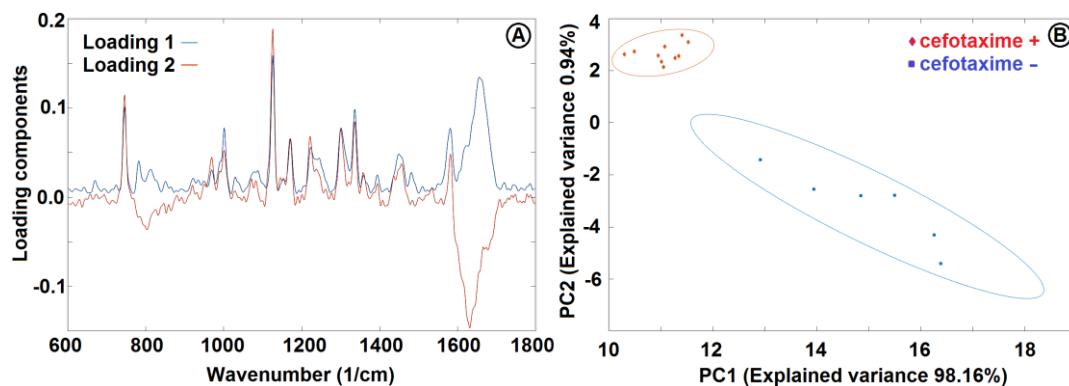
286 **Figure 8.** Raman spectra of *E. coli* cells cultivated for 3h in CASO broth with (+) and without (-)  
 287 cefotaxime, washed with PBS. Averaged from 10 (+) and 6 (-) spectra. Measured at Renishaw In Via  
 288 with excitation at 532 nm, 100% power, 20x objective and 30s integration, normalized at  $1001\text{ cm}^{-1}$ .  
 289 The normalization peak was highlighted in the spectrum by a green asterisk (\*). Red asterisks (\*)  
 290 denote the peaks which were selected for further analysis, see text.



291

292 **Figure 9.** Ratios of Raman peaks for cells cultivated with (2 mg/L) and without (0 mg/L) cefotaxime:  
 293  $1454/1482\text{ cm}^{-1}$  and  $783/1001\text{ cm}^{-1}$ . The differences in peak ratios for the experimental and control  
 294 group were statistically significant. The error bars represent 2 SD.

295



296

297 **Figure 10.** PCA loadings (A) and PCA analysis (B) of *E. coli* cultivated in CASO broth with and  
 298 without 2 mg/L cefotaxime added to the medium. See Figure 8 for the Raman spectra and section 2.7  
 299 for sample treatment details. PC1 and PC2 were used for discrimination between the cells with (+)  
 300 and without (-) cefotaxime. The ellipsoids represent 95% probability level.

301

302 **4. Conclusions**

303 Optical trap and a microchamber based optofluidic system allowed us to effectively isolate the  
 304 individual bacterial cells of *E. coli* and observe the changes of morphology induced by cephalosporin  
 305 antibiotic cefotaxime. The system proved to be the ideal combination for simple non-contact  
 306 micromanipulation of individual cells and their cultivation in a highly controlled environment with  
 307 the possibility of time-lapse recording of their morphology and development. Based on Raman  
 308 spectra of optically trapped cells of *E. coli*, we were able to discriminate by PCA between the cells  
 309 stressed by cefotaxime and the control cultivated in pure CASO broth. We also identified several  
 310 peaks which changed their magnitude with varying exposure of the cells to cefotaxime. These  
 311 measurements were realized with 785 nm Raman excitation and trapping wavelength. Raman  
 312 microspectroscopy of bacterial samples at 532 nm provided us with spectra that are complementary  
 313 to the measurements at 785 nm. These data independently support the finding of Kirchhoff et al.  
 314 [16], that the ratio of the peaks at  $1458\text{ cm}^{-1}$  and  $1485\text{ cm}^{-1}$  changes with drug concentration in the  
 315 medium. We identified and assigned all the major Raman peaks typical for *E. coli* according to a  
 316 reference [11]. The intensity of peaks and its relative intensity changes were different in the spectra  
 317 recorded at 785 nm and 532 nm excitation.

318 We present this work as a proof of principle that our approach combining microfluidic  
 319 chambers with LTRS provides a solid optofluidic platform for single cell manipulation and analysis  
 320 by optical microscopy and Raman spectroscopy. In order to design novel microfluidic chip for  
 321 bacterial separation and identification from different body fluids, such as sputum, blood, or urine,  
 322 we will exploit LTRS in connection with different microfluidic techniques based e.g. on centrifugal  
 323 force, dielectrophoresis, microfiltration, flow-focusing, surface acoustic wave, etc. to sort and  
 324 cultivate cells in microchambers. We are aiming for an advanced connection of microfluidics and  
 325 optical trapping for analysis of bacteria which would enable fast and accurate determination of  
 326 bacterial sepsis.

327 **Acknowledgments:** We thank the staff at the Institute for Medical Microbiology at the Jena University Hospital  
 328 for the collaboration. The research was supported by GACR GA16-12477S, Ministry of Education, Youth and  
 329 Sports of the Czech Republic (project LO1212). The research infrastructure was funded by Ministry of  
 330 Education, Youth and Sports of the Czech Republic and European Commission (project CZ.1.05/2.1.00/01.0017)  
 331 and by the Czech Academy of Sciences (project RVO:68081731). U.N. and J.K. acknowledge funding from the  
 332 BMBF via the CSCC (FKZ 01EO1502) and Research Campus InfectoGnostics (FKZ 13GW0096F). This article is  
 333 based upon work from COST Action "Raman-based applications for clinical diagnostics - Raman4Clinics" (BM  
 334 1401), supported by COST (European Cooperation in Science and Technology). Financial support from the DFG  
 335 via the Jena Biophotonic and Imaging Laboratory (JBIL, FKZ PO 633/29-1, BA 1601/10-1) is highly  
 336 acknowledged.

337 **Author Contributions:** Z.P. conceived and performed the experiments, analyzed the results and wrote the  
338 article. S.B. designed and built the experimental apparatus, performed the experiments and analyzed data; J.J.  
339 co-designed and manufactured the microfluidic chips; J.K. and U.N. conceived the experiments, prepared  
340 together with A.T. the cells and co-wrote the article; O.S. conceived the experiments, coordinated the project  
341 and secured the financial support; P.Z. provided consultations and secured the infrastructural and financial  
342 support.

343 **Conflicts of Interest:** The authors declare no conflict of interest.

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