

# Single Cell Level Dielectrophoretic Responses & Dielectrophoretic Deformations of Monocytes to Quantify Population Heterogeneity

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**Abstract**— Single-cell dielectrophoretic movement and dielectrophoretic deformation of monocyte cells were interrogated applying 20 V<sub>pp</sub>, 50 kHz to 1 MHz signal in the 3D carbon electrode array. Heterogeneity of the monocyte population is shown in terms of the crossover frequencies, translational movement, and deformation index of the cells. The results presented that crossover range for monocytes was 100 kHz-200 kHz, the translational movement of the cells was rapidly altered when the initial positions of the cells were in the negative dielectrophoretic region. Finally, the deformation index of the monocyte population varied from 0.5 to 1.5.

## I. INTRODUCTION

Monocytes compose 5% of leukocytes in the human body and hold an important role in the immune system. Understanding the origin and fate of monocytes is crucial to underline their behavior in the cancer microenvironment. Monocytes have different roles in tumor progression from tumor formation to invasion, metastasis, and angiogenesis [1, 2]. In particular, tumor-associated macrophages (TAM) are one of the key players in tumor development and progression in many types of cancer [3, 4, 5]. TAM are monocyte-derived immune cells and are classified based on their cytokines and immune functions as M1- and M2-polarized subtypes [6]. The M1 subtype suppresses while the M2 subtype promotes tumor growth. Therefore, understanding population heterogeneity, isolation and characterization of monocytes and monocyte subpopulations are required for precise diagnostics of tumor grades and development of personalized medicine.

Here, we use Dielectrophoresis (DEP) to characterize such population heterogeneity. Since DEP does not require any pre-labelling of the cells, it allows for direct characterization of monocyte subtypes based on their intrinsic properties without altering their genotype and phenotype. In addition to DEP [7], there are several well-established cell separation and characterization methods. Fluorescence-activated cell sorting (FACS) [8, 9] and magnetic-activated cell sorting (MACS)

[10] techniques are among the widely used cell enrichment and isolation methods. Moreover, hydrodynamic forces [11, 12], optical tweezers [13] and free flow acoustophoresis (FFA) [14] have been used for cell enrichment and manipulation.

DEP has many advantages, such as cells remain viable, maintain their genetic and phenotypic properties [15], and it is a low-cost technique in terms of not requiring fluorescent labels on the cells [16, 17, 18]. Dielectrophoretic responses of cells can be monitored when the cells are exposed to the nonuniformly distributed electric field in the low-conductive suspension medium. Hence, cells are experienced either attractive dielectrophoretic forces, or repulsive dielectrophoretic forces according to their polarizability [7, 19]. DEP has been used not only for cell isolation but also for manipulation of cells [20, 21, 22], DNA [23] and proteins [24].

Dielectrophoretic forces have been generated by patterned electrodes in microfluidic channels. In the earlier studies, various geometries and dimensions have been tested for electrodes in order to optimize dielectrophoretic stimuli of particles or biologic samples [25]. Recent studies in dielectrophoresis community mostly focused on rapid detection, low cost and high-throughput cell enrichment [16, 26, 27, 28]. Hence, the manufacturing of dielectrophoresis platforms, low-cost material usage, disposable and environment-friendly products become important.

Furthermore, we used 3-dimensional carbon electrodes (3D carbon DEP) to create dielectrophoretic forces that might reflect the heterogeneity of monocyte populations [29, 30]. We quantified the displacement and deformation of monocytes under the influences of dielectrophoretic forces when 20 V<sub>peak-to-peak</sub> (V<sub>pp</sub>) voltage with frequencies ranging from 50 kHz to 1 MHz have been applied. We analyzed the position of the single cells in the 3D carbon DEP chip to determine the dielectrophoretic responses of the single monocyte cells. We measured the height and width of the cells to calculate the deformation index of the cells [31].

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## II. MATERIALS AND METHODS

### 1. 3D CARBON-DEP DEVICE MANUFACTURING

The fabrication of 3D carbon-microelectrodes has been described in detail [32, 33]. In short, a two-step photolithography process with SU-8 (Gersteltec, Pully, Switzerland) was implemented on a silicon wafer to create the 3D precursor structure to the micro-electrodes. The photoresist pattern was then carbonized at 1000°C in a nitrogen atmosphere. The carbon electrode array featured 218 intercalated rows with 14 or 15 electrodes each. Individual electrodes had a height of 100 μm and a diameter of 50 μm. A thin layer of SU-8 was then applied to isolate the planar connectors and make the bottom channel plane. From a 127 mm thick double-sided pressure-sensitive adhesive (PSA, Switchmark 212R, Flexcon, Spencer, MA, USA), a 1.8 mm wide, 3.2 cm long channel was cut and glued to a pre-drilled polycarbonate [34]. This arrangement was then manually placed around the carbon-electrode array and closed using a rolling press.

### 2. DEP Buffer Preparation

A DEP buffer with low electrical conductivity was prepared according to previous formula [35], 8.6% sucrose (Product no: LC-4469.1, neoFroxx, Hesse, Germany), 0.3% glucose (CAS Number 59-99-7, Sigma-Aldrich, Darmstadt, in accordance with the pre-specified formula [34], Germany) and 0.1% dilution. Bovine Serum Albumin in distilled water (BSA, Product Code: P06-1391050, PAN-Biotech, Aidenbach, Germany). The conductivity of the final suspension was 20 μS / cm as measured (Corning Model 311 Portable Conductivity Meter, Cambridge Scientific Products, Watertown, MA, USA).

### 3. Cell Preparation

U937 monocyte cells are human myeloid leukemia cell lines obtained from the American Type Culture Collection (ATCC, Manassas, VA, USA) were maintained in 10% fetal bovine serum (FBS; PAN-Biotech, Aidenbach, Germany) RPMI (Roswell Park Memorial Institute) - 1640 medium (Product Number: P04-18047, PAN-Biotech, Aidenbach, Germany) 37°C from (EC 160 CO2 Incubator, Nuva, Ankara, Turkey) in a humidified incubator at 5% CO<sub>2</sub> - 95% air atmosphere in plastic bottles.

Cells were centrifuged at 3000 rpm (Z601039 - Hettich® EBA 20 centrifuge, Merck, Darmstadt, Germany) for 5 minutes to remove the remaining culture medium and resuspended twice in DEP buffer.

### 4. Experimental Setup

The experimental setup consisted of the signal generator (Model: GFG-8216A, GW Instek, New Taipei City, Taiwan), an oscilloscope (Part Number: 54622D, Agilent Technologies, Santa Clara, CA, USA) to create the electric field. A desktop-acquired, upright microscope (Model: Nikon ME600 Eclipse, Nikon Instruments Inc., Melville, NY, USA) to acquire and analyze cells for monitoring, recording and analyzing images (Hewlett-Packard Company, Palo Alto, CA, USA), a programmable syringe pump to flow cells and DEP buffer (Model: NE-1000, New Era Pump Systems Inc, Farmingdale, NY, USA) and our 3D carbon-DEP device. To create a

reservoir, 20–200 μL pipette tips (Manufacturer ID: 3120000917, Eppendorf, Hamburg, Germany) used as a reservoir at the inlet and outlet of the microchannel. Tygon micro-perforated tube (Manufacturer ID: AAQ02103-CP S-54-HL, Cole-Parmer, Vernon Hills, IL, USA) was used to connect the syringes and microchannels of the 3D carbon-DEP chip.

### 5. Experimental Procedure

First, the 3D carbonDEP chip was sterilized with 70% Ethanol and rinsed with DI (deionized) water. Next, the chip was filled with DEP buffer and all the bubbles on the chip were removed. 40 μL of the cell suspension was loaded into the chip using a syringe pump. The flow rate was 10 μL/min. When the cells reached the electrode area, the flow was stopped, and the cells were released for 30 seconds. A signal with 20 Vpp frequencies ranging from 50 kHz - 1 MHz was then applied using the function generator [36]. The movement of the cells was generated due to the dielectrophoretic forces, there was no fluid flow in the microfluidic device.

### 6. Image Acquisition and Analysis

All images were recorded using a 10 × lens mounted on the Nikon Eclipse vertical optical microscope. Then, the acquired images were analyzed using ImageJ (version 2.0 National Institutes of Health, Rockville, MD, USA). Since each image considers the location information of the cells for a given frequency, we measured the positions of the cells in the electrode array. Afterwards, we evaluated the location of the cells according to type and magnitude of the dielectrophoretic forces they experienced. The dielectric forces are valued from 3 to -3. The dielectric force on 3 considered as the strongest pDEP and -3 as the strongest nDEP. We used VideoLAN Client (VLC, VideoLAN version 1.8, Paris, France) to convert image sequences into the movies.

## III. RESULTS

DEP allows characterization of cells based on their electrical polarizability and the resulting specific translational dielectrophoretic forces ( $F_{DEP}$ ) given in (1).

$$F_{DEP} = 2\pi\epsilon_m r^3 \text{Re}[f_{CM}] \nabla E_{rms}^2 \quad (1)$$

where applied electric field (E) and the permittivity of the suspending medium ( $\epsilon_m$ ) are the parameters that equally affects all types of cells in the electrode array. However, the real part of the Clausius-Mossotti factor  $\text{Re}[f_{CM}(\omega)]$  introduces specificity based on the membrane thickness (d), radius (r), conductivity ( $\sigma_{int}$ ) and permittivity of the cells ( $\epsilon_{int}$ ) and their surrounding buffer, in (2, 3),

$$f_{cm} = \frac{\epsilon_{eff}^* - \epsilon_m^*}{\epsilon_{eff}^* + 2\epsilon_m^*} \quad (2)$$

where  $\epsilon_m^*$  is the complex permittivity of the medium,  $\epsilon_{eff}^*$  is the effective permittivity of the cell using (3) and (4), according to single-shell model, the imaginary number (j) [25, 26].

$$\epsilon^* = \epsilon - \frac{j\sigma}{\omega} \quad (3)$$

$$\epsilon_{\text{eff}}^* = \epsilon_{\text{mem}}^* \frac{\left(\frac{r}{r-d}\right)^3 + 2\frac{\epsilon_{\text{int}}^* - \epsilon_{\text{mem}}^*}{\epsilon_{\text{int}}^* + 2\epsilon_{\text{mem}}^*}}{\left(\frac{r}{r-d}\right)^3 - \frac{\epsilon_{\text{int}}^* - \epsilon_{\text{mem}}^*}{\epsilon_{\text{int}}^* + 2\epsilon_{\text{mem}}^*}} \quad (4)$$

These intrinsic dielectric properties determine the polarizability of the cells under the applied non-uniform electric field. Hence, each specific cell type will experience a specific DEP force. When the  $\text{Re}[f_{\text{cm}}(\omega)]$  is positive, the cells migrate towards regions of high electric field gradient in a phenomenon known as positive-DEP (pDEP). When the  $\text{Re}[f_{\text{cm}}(\omega)]$  is negative, negative DEP (nDEP) occurs, and cells migrate away from the field gradient. The frequency when the cells experience zero  $F_{\text{DEP}}$  is defined as the crossover frequency (CF).

In order to determine the dielectrophoretic responses of the cells, the location of each cell was measured in each frequency when the electric field was applied. Fig. 1 illustrated the number of cells those experienced strong pDEP (3), pDEP (2), weak pDEP (1), CF (0), weak nDEP (-1), nDEP (-2), strong nDEP (-3) at 50 kHz, 100 kHz, 200 kHz, 300 kHz, 400 kHz and 1000 kHz frequencies when 20 V<sub>pp</sub> was applied.

In order to quantify heterogeneity of the monocyte population in terms of their dielectrophoretic behaviors at least 50 single cells were analyzed for each case. Fig. 2 shows the trajectory of single monocytes when they started their motion at CF, weak nDEP (-1), nDEP (-2) and strong nDEP (-3). When the cells started their movement at pDEP, they remained at pDEP region without moving to CF or nDEP.

We followed 80 monocyte cells in the electrode array when DEP forces were acting on them. There was no fluid flow in the electrode array. We categorized cells according to their initial DEP responses. Fig. 2a presents the DEP behavior of the cells when they started their motion at CF.

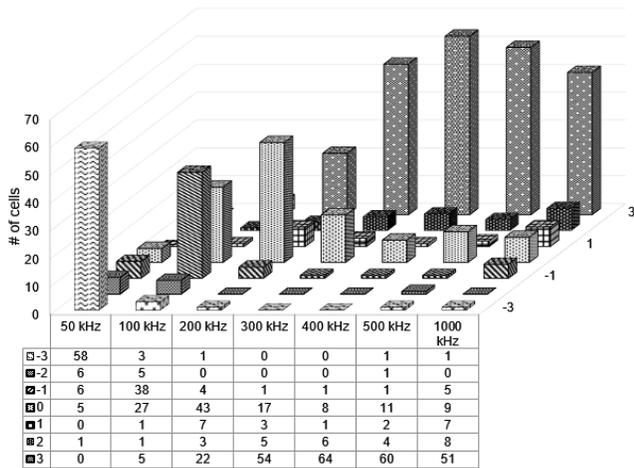


Figure 1. DEP response of the monocyte population. The number of monocyte cells was counted at strong pDEP (3), pDEP (2), weak pDEP (1), CF, weak nDEP (1), nDEP (2), strong nDEP (-3) regions of the electrode array when 50 kHz to 1 MHz frequency, 20 V<sub>pp</sub> was applied. 80 cells for each frequency was counted.

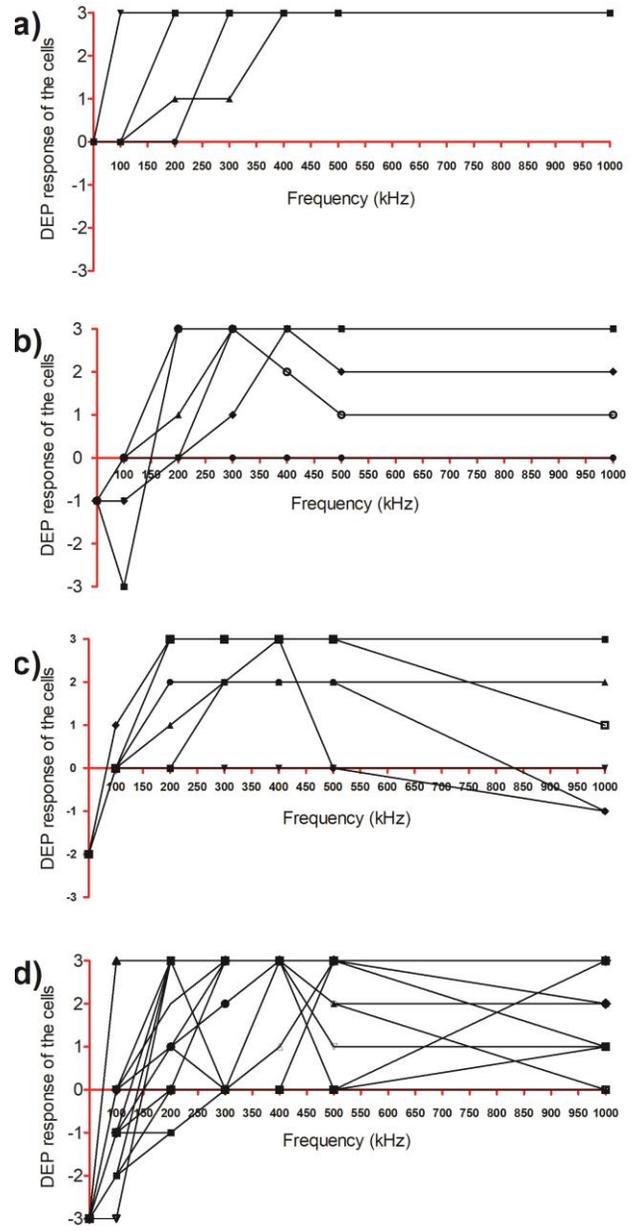


Figure 2. The trajectory of single monocytes in the presence of the nonuniform electric field with 20 V<sub>pp</sub>, 100 kHz to 1 MHz frequency range. DEP responses of the cells when they started their behavior in the a) CF, b) weak nDEP, c) nDEP, d) strong nDEP regions of the electrode array.

Next, we evaluated the responses of the monocytes when they started at weak nDEP (Fig. 2b), nDEP (Fig. 2c), and strong nDEP (Fig. 2d). As mentioned above, we used fluid flow to load the cells into the microfluidic device, there was no any fluid flow in the electrode array during the experiments.

In the absence of the fluid flow, in the presence of the DEP forces, the diameters of the cells changed as shown in Fig. 3. We measured the height (H) and width (W) of the 50 monocyte cells for each frequency ranging from 100 kHz to 1 MHz when 20 V<sub>pp</sub> was applied.

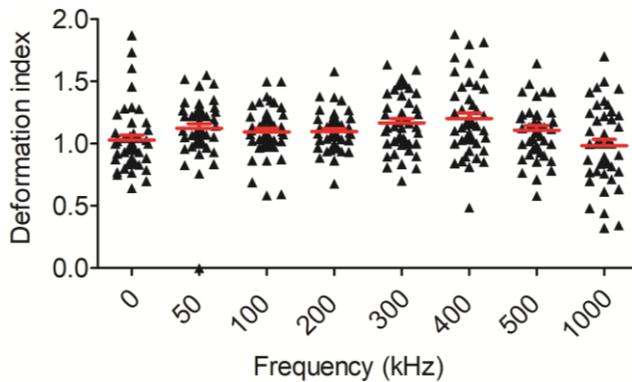


Figure 3. DEP deformation indexes for monocyte population. Deformation index was calculated by measuring the height and width of the single monocytes. 50 monocytes were analyzed for each frequency (Supplementary movie). Red lines show means and standard error values.

We calculated the deformation index (DI) of each monocyte using the following formula (5) as described in [26].

$$DI = \frac{H}{W} \quad (5)$$

Fig. 4, as a representative, shows the deformation of single monocytes in the presences of DEP forces. We measured the height and width of three monocytes frame-by-frame to follow the change of their deformation index for the varying DEP forces. We labelled monocytes in red, blue and yellow lines in the images, Fig. 4a. Fig. 4b displays the change of monocyte deformation index (labelled in Fig. 4a) according to applied dielectrophoretic forces.

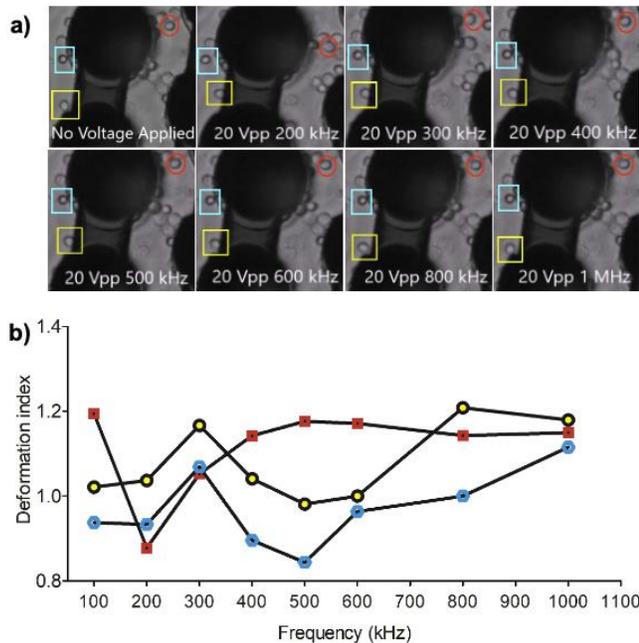


Figure 4. DEP deformation trend for the single monocytes. a) Snapshots of electrode arrays with labeled cells that shows motion and deformation of cells during the applied electric field (Supplementary movie). b) The change in the deformation index for the labeled cells in the electrode array.

## IV. CONCLUSION

Here we presented experiments that quantify heterogeneity of monocytes according to their intrinsic dielectrophoretic properties in terms of dielectrophoretic movement and dielectrophoretic deformation index at the single-cell level. We conclude that the change of the deformation index is correlated with the generated DEP forces on the monocytes. When the cells are attracted by strong pDEP, their height decreases, and width increases then their deformation index become less than 1. When the cells are at the crossover frequency, the existing DEP forces are so weak, almost zero, therefore, deformation index of the cells was closer to one. When the electrodes repel the cells, their deformation index increases. In this study, we particularly emphasize on DEP generated deformation index of monocytes since monocytes and other white blood cells are capable of infiltrating different types of tissue. The intrinsic cellular heterogeneity of white blood cells might phenotypically affect their plasticity that we can quantify using DEP.

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