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A system that accomplishes a function analogous to a treadmill at the cellular scale helps decouple the spatial and temporal gradients during neutrophil chemotaxis.
A Neutrophil Treadmill to Decouple Spatial and Temporal Signals during Chemotaxis

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10 After more than 50 years of debates, the role of spatial and temporal gradients during cell chemotaxis is still a contentious matter. One major challenge is that when cells move in response to a heterogeneous chemical environment they are exposed to both spatial and temporal concentration changes. Even in the presence of perfectly stable chemical gradients, moving cells experience temporal changes of concentration simply by moving between locations with different chemical concentrations in a heterogeneous environment. Thus, the effects of the spatial and temporal stimuli cannot be dissociated and studied independently, hampering progress towards understanding the mechanisms of cell chemotaxis. Here we employ microfluidic and other engineering tools to build a system that accomplishes a function analogous to a treadmill at the cellular scale, holding a moving cell at a specified, unchanging location in a chemical gradient. Using this system, we decouple the spatial and temporal gradients around moving human neutrophils and find that temporal gradients are necessary for the directional persistence of human neutrophils during chemotaxis. Our results suggest that temporal chemoattractant changes are important during neutrophil migration and should be taken into account when deciphering the signalling pathways of cell chemotaxis.

Introduction

Neutrophils are the most effective barrier in preventing the invasion and spreading of microorganisms within the human body. Failure of neutrophils to promptly arrive at sites of infection or inflammation can result in uncontrollable infections. At the same time, overzealous neutrophil infiltration can lead to chronic inflammation and unnecessarily damage normal tissues and impair organ function e.g. in severe forms of asthma and arthritis, or ischemia-reperfusion injury. While most of the neutrophils in the body reside in the blood and enter tissues only in response to local chemical gradients inside these tissues, better understanding of the response of neutrophils to these gradients could create new opportunities for effective therapies for infections and chronic inflammation that are more selective and more effective.

More than a hundred signalling molecules involved in different aspects of neutrophil motility have been identified in the past decades. However, we still do not understand how these molecules work together to achieve neutrophil motility. Traditional methods that helped uncover the signalling molecules are not efficient in finding the systems that organize the same group of molecules. The bottom-up approach allowed by the traditional molecular biology methods can only help finding some relations between pairs of molecules but is limited when it comes to analyzing the larger systems of molecules. A more appropriate strategy to address the systems-level problem is usually a top-down approach, where one starts by analyzing the response of neutrophils to precise perturbations of the gradients and begins to infer the organization of signalling networks. Two sensing mechanisms are commonly considered to optimize migratory responses of neutrophils in complex environments, but controversy exists on which of these is responsible for chemical gradient sensing. A spatial sensing mechanism uses differences in chemokine concentration between the front and the back of the cell to direct their migration towards higher concentrations. A temporal mechanism relies on changes in concentration over time to direct cell migration towards areas with the largest change. Arguments for a spatial gradient come from observations of the pseudopod formation in a stationary neutrophil subsequent to gradient exposure, or after the ability of a cell to move or extend protrusions has been inhibited by latrunculin. On the other hand, temporal mechanisms are supported by observations of neutrophil responses to waves of chemoattractant and reversal of the direction of migration following concentration decrease of uniform chemotactic fields and are comparable to gradient sensing in bacteria. Our earlier observations using fast switching of chemoattractant...
gradients suggest that neutrophils can employ at least some temporal sensing mechanisms to direct their responses to microenvironment changes\textsuperscript{16}.

One limiting factor for advancing the knowledge on neutrophil migration in response to heterogeneous environments is the lack of adequate experimental systems\textsuperscript{17}. In most experiments, the spatial and temporal components are coupled, because moving cells are exposed simultaneously to spatial and temporal gradients. Even in the presence of utmost stable chemical gradients\textsuperscript{18}, cells moving in a spatial gradient of chemokine, by virtue of changing their location inside the gradient, are being exposed to temporal changes in concentration. Experiments that attempt to change the concentration of chemokines around cells, are limited by the physics of chemical diffusion which lead to the formation of simultaneous spatial gradients during any concentration change\textsuperscript{10}. Moreover, experiments involving the immobilization of the neutrophils by disrupting the motility apparatus using chemical\textsuperscript{12} or physical restrictions (e.g. low temperature\textsuperscript{19}) are difficult to interpret because they perturb the signalling pathways they attempt to resolve. Solving such problems requires new tools that can analyze cellular responses in fully functional neutrophils, with intact signalling networks, and in precise extra-cellular conditions.

Here we demonstrate a new tool that actively decouples the contribution of spatial and temporal gradients of a chemokine to neutrophil migration. For this, we continuously and precisely change the location of the cell within the gradient in synchronicity with the cell migration, to achieve a complete cancellation of the temporal stimulus that the moving neutrophil would otherwise experience. Such capability is not available in any of the current chemotaxis devices, in which the control of the gradient is passive, restricted by physical design of the device, and independent of cell migration. Observations enabled by the new technology provide unexpected insights into the mechanisms of neutrophils sensing the chemical

\textbf{Fig 1. Neutrophil treadmill platform} (A) The platform consists of a gradient generator that expels a gradient onto a glass slide on a microscope stage without touching or being affected by stage movement. The cell on the glass slide is exposed to the gradient and begins to migrate. As the cell is migrating, the microscope is imaging the cell and a computer algorithm is determining the displacement of the cell for each time step. The cell movement information is fed into the microscope stage which is moved in an equal and opposite direction to the cell’s movement. This returns the cell to its original position relative to the gradient. Since the gradient generator is separate from the stage movement, the gradient remains in a constant position and whole system provides the feedback to maintain the cell’s position relative to the chemokine gradient. (B) As a cell migrates up a gradient it is exposed to a different concentration of chemokine. When feedback is applied, the cell is actively moved in an equal and opposite direction by the stage and, therefore, the local chemokine concentration around the cell is constant over time. (C) The camera captures a DIC image around the region of interest. The region of interest is processed through a series of image processing steps to allow for the algorithm’s determination of the cell’s position and subsequent feedback to the stage. (D) While a cell migrates in the direction of the chemokine gradient, the stage compensates equally and oppositely to the cell’s motion so that the cell remains in the same place relative to the gradient and the field of view just as a runner on a treadmill does not actually displace.
gradients, and could eventually lead to the development of rational therapeutic approaches, capable of fine tuning the neutrophil responses appropriate to various diseases.

Materials and Methods

Preparation of human neutrophils and media

De-identified, fresh human blood samples from healthy, consenting adults were purchased from Research Blood Components (Alston, MA). The blood was collected into tubes containing sodium heparin (Vacutainer; Becton Dickinson). HetaSep separation buffer (STEMCELL Technologies, Vancouver, BC) was added to blood in 1:5 ratio and mixed gently. The resulting mixture was allowed to sediment for 45 minutes to separate nucleated cells from erythrocytes. The supernatant containing nucleated cells was pipetted into a separate tube and combined with 4 parts RoboSep buffer (STEMCELL Technologies, Vancouver, BC), then centrifuged at 1000 rpm for 5 minutes. Neutrophils were isolated using the EasySep Human Neutrophil Enrichment Kits (STEMCELL Technologies, Vancouver, BC) following the protocol provided by the manufacturer. After isolation, neutrophils were re-suspended in 1 mL IMDM (ATCC, Manassas, VA) with 20% FBS (Sigma-Aldrich, St. Louis, MO). Neutrophils were used within 2 hours of isolation, and kept at 37°C and 5% CO2 until use.

Leukotriene B4 (LTB4) (Cayman Chemical, Ann Arbor, Michigan) was used as a chemoattractant. A final concentration of 100 nM LTB4 in Hank’s Balanced Salt Solution (HBSS) (Life Technologies, Grand Island, NY) and 0.2% human serum albumin (HAS) (Sigma-Aldrich, St. Louis, MO) was prepared. An additional 1 µM of fluorescein isothiocyanate (FITC) was added to this mixture to allow observation of the gradient. HBSS and 0.2% HAS were used as the ambient solution.

Design and fabrication of microfluidic device

Microfluidic devices were constructed of two layers of polydimethyl siloxane (PDMS, Dow Corning, Midland, MI) bonded together on top of a glass coverslip. First, PDMS was cast as a 1 mm thick layer onto a silicon wafer on which a 100 µm layer of photoresist (SU-8, Microchem, Newton, MA) was micro-patterned using standard photolithography techniques. Second, a layer of PDMS roughly 100 µm thick was deposited by spin-coating on a blank silicon wafer. Both PDMS layers were cured at 65°C for at least 24 hours. The thicker PDMS was carefully cut and peeled off of the micro-patterned wafer. A 0.75 mm hole-punch (Harris Uni-Core, Ted Pella, Redding, CA) was used to create fluid inlets and outlets for each device. Both this piece of PDMS and the thin layer on the blank wafer were exposed to an oxygen plasma for 35 seconds in a plasma asher (Nordson March, Concord, CA), then brought into contact to form a bond so that the channels on the thick layer were sealed against the PDMS of the thin layer, with the punched holes being the only inlets. The wafer with the bonded PDMS was set on a hot plate at 75°C for 10 minutes. The bonded pieces were then carefully cut and peeled off of the blank wafer and trimmed to make individual devices. At this point the ends of the channels were trimmed so that the inlets led to open channels that terminated roughly 100 µm from the bottom of the channel. The trimming was done at a steep angle to make the device as thin as possible at the open end. The oxygen plasma step was then repeated to bond devices on top of a glass cover slide to provide additional support during handling. The end of this glass cover slide was bonded far enough from the outlets of the channels to prevent the cover slide from interfering with channel positioning.

Generation of the chemical gradients

Pieces of flexible plastic tubing (Tygon, Greene Rubber Co., Woburn, MA) were cut to the lengths of 50 cm (x2) and 100 cm. One end of each piece of tubing was connected to a 30G blunt needle connected to a 5 mL plastic syringe (Fisher Scientific, Pittsburgh, PA). The other ends of the pieces of tubing were inserted into the punched inlet and outlet holes with the two 50 cm pieces being inserted into the inlet holes and the 100 cm piece of tubing being inserted into the outlet hole. The device was attached to a micromanipulator so that the outlet could be positioned near the centre of the microscope field of view and just above the surface of a 50 mm glass bottom dish (MatTek, Ashland, MA). The glass bottom dish was coated with 100 nM human-fibronectin (Sigma-Aldrich, St. Louis, MO) and filled with HBSS + 0.2% HSA. The two syringes for the inlet holes were raised above the device while the syringe attached to the outlet hole was lowered below the device to allow for gravity driven flow to control the delivery or withdrawal of fluid through the device channels. HBSS + 0.2% HSA containing 100 nM LTB4 and 1 µM FITC was perfused through the center channel, and was taken back up by the surrounding two channels. By matching the total ejection rates of the centre and outermost channels, with the uptake in the drain channels, a spatial gradient of LTB4 is generated and precisely controlled. The role of the two outermost channels were used to perfuse additional HBSS + 0.2% HSA to keep the gradient spatially confined around the tip of the device and block the diffusion of LTB4 into the dish. This feature is critical to preventing artefacts from a temporal increase in the chemokine concentration for all the cells inside the dish, including the tracked ones.

Feed-back control of neutrophil position during migration

Neutrophils were then loaded into the 50 mm glass bottom dish, allowed to settle for 5 minutes, and then exposed to the gradient. A heating stage (Carel, Manheim, PA) was used to maintain a temperature of 37°C within the dish. The neutrophils were imaged on an inverted microscope (Nikon TE2000) with DIC filters at 20x magnification using a digital camera (Retiga 2000R FAST, QImaging, Surrey, BC, Canada). A motorized stage (Proscan II, Prior Scientific, Rockland, MA) was used to control the movement of the stage. The position of the cell of interest in the microscope field was controlled using a modified version of the open-source Micro-Manager platform20. Our
modification replaced the existing Tracker code with a system that provides multiple approaches to detecting cell displacement: a correlation-based method (as originally encoded), a fast gradient-based motion measurement algorithm with sub-pixel resolution\textsuperscript{21, 22}, and a segmentation-based approach. Initial experiments revealed that the segmentation approach was the most accurate, so it was used for all results reported in this paper.

The segmentation approach works as follows. First, a region around the most recent cell position is selected. The mean and standard deviation of pixel brightness in this region are computed, and the region is thresholded at a user-specified multiple of standard deviations from the mean. The Erode operator of ImageJ is applied to the thresholded image twice in succession, followed by the Dilate operator twice. The Analyze Particles operator is used to identify individual regions remaining, and the largest of these is assumed to be the cell. Based on the expected direction of cell motion (user-defined), one edge of this region is defined as the leading edge. The position in the orthogonal direction is taken as the centre of the bounding box containing this region. Each operator in this process is a function built into ImageJ. This method was used to determine the position of a single cell of interest during each experiment. The collected images were later analyzed using the same method to measure the displacement of other cells relative to the target cell.

To adjust the stage position, two affine transforms were applied to the measured cell displacement. The first enabled adjustments of the scale and offset of the feedback, while the second corrected for scaling and rotation of the stage coordinates relative to camera coordinates. The resulting stage motion was given by

\[
\begin{bmatrix}
    x_{\text{stage}} \\
    y_{\text{stage}}
\end{bmatrix} = \begin{bmatrix}
    A & B & C \\
    D & E & F
\end{bmatrix} \begin{bmatrix}
    a & b & 0 \\
    c & d & 0 \\
    0 & 0 & 1
\end{bmatrix} \begin{bmatrix}
    x_{\text{cell}} \\
    y_{\text{cell}}
\end{bmatrix}
\]
where the 3x3 matrix with lower-case variables defines the transformation from camera to stage coordinates, and the 2x3 matrix with upper-case variables defines the scaling and offset. To keep the cell in place, A=E=-1 and B=C=D=F=0. Other transformations, such as over- and under-compensation for cell motion, rotation, and constant cell velocity can be applied through appropriate values of these variables.

**Neutrophil migration analysis**

The stability of the gradient was determined by taking fluorescent images of the gradient over time, extracting a kymograph from the images in ImageJ, and determining the intensities in MATLAB (MathWorks, Natick, MA) to visualize the intensities of the gradient at specified points over the duration of the experiment.

To explain these results concisely we introduce several terms. Total Displacement refers to the integrated motion of the cell in any direction relative to its immediate surroundings. Effective Displacement refers to the component of Total Displacement that occurs in the direction of increasing chemokine concentration. Net Displacement refers to the integrated vector motion of the cell relative to its immediate surroundings. Gradient Displacement refers to the displacement of the cell in digital images relative to the source of chemokine gradient. For example, a cell which moves 4 µm in the direction of the gradient and 3 µm in an orthogonal direction, has a Total Displacement of 7 µm, Effective Displacement of 40 µm, Net Displacement of 5 µm ($\sqrt{4^2 + 3^2}$). When the stage is then moved to bring the cell back to its starting location, the Gradient Displacement is 0 µm.

MATLAB was used to calculate the average lifetime velocity,

$$v = \frac{\text{Total Displacement}}{\text{total time of migration}}$$

and directional persistence,

$$DP = \frac{\text{Gradient Displacement}}{\text{total distance traveled}}$$

of each cell from the positions of the cell over time determined by the tracking algorithm.

For both feedback conditions and no feedback conditions, 10 cells were measured from 10 different experiments. Velocities were compared using the independent Student t-test. Differences were considered significant above a 95% confidence interval. The noise introduced by the system was determined by calculating the root mean squared of the error in the tracking algorithm.

**Results and discussion**

To decouple the influence of spatial and temporal gradients during neutrophils chemotaxis, we employed a system that combined a microfluidic gradient generator, a motorized stage, and a microscopy system in a computer-controlled feedback control loop (Fig.1A). The goal was to move the stage in response to neutrophil migration, such that the neutrophil remains in the same position relative to the spatial gradient and experience no change in concentration over time (Fig.1B). The time required for each computation and actuation loop was less than 2 seconds, faster than the shape changes of the neutrophils. The cell tracking algorithm worked well in phase contrast as well as differential interference contrast. This allowed us to avoid using fluorescent dyes for cell tracking, which could potentially interfere with cell migration when taking into account the large number of images required for implementing a robust feedback system (more than 30 images every minute for the duration of the experiment). This approach also has the advantage that it keeps all fluorescence channels of the microscope available for molecular studies during cell migration, or interface with physical measurements of cell migration e.g. traction force microscopy.

We verified the ability of the platform to track individual objects and move the microscope stage correspondingly, by applying the system first to a static object and then to a controlled dynamic object. When the system was applied to a stationary object we observed no stage drift over time. When a micromanipulator was used to precisely displace a bead the system was able to accurately track the movement and feed the information into the stage controllers so as the return the head to its original position after each controlled displacement. We also verified the ability of the system to recognize human neutrophils undergoing shape changes during migration (Fig.1C), and track the motion of individual neutrophils and move the stage following the feedback algorithm (Fig.1D).

By varying the heights of the reservoirs and length of the tubing for the input and output solutions of the gradient generator (Fig.2A), flow rates of 10 µL/min, 20 µL/min, and 15 µL/min were achieved for the chemokine solution, drain, and distal buffer solution channels, respectively. These flow rates and the dimensions and distances between channels of the gradient generator caused a semi-circular gradient to be formed at the end of the gradient generator on the surface of the glass slide (Fig.2B). It is important to note that the gradient generated by this system is such that it completely avoids the build-up of chemokine on top of neutrophils at a distance from the gradient generator. Unlike classical micropipettes, we took special care to balance the flows through the distal channels such that all the chemokine injected in the dish is recovered. In addition to matching the ejection and uptake flow rates, addressed previously by microfluidic designs like the push-pull probes, multifunctional pipettes, or quadropod gradient generators, we implemented two more channels distal from the centre channels. Flow patterns between these and drain channels are such that they confine the chemokine diffusion at the tip of the device, by removing all chemokine diffusing away from the tip, before reaching the dish. This feature is key for preventing slow chemokine build-up in the dish over time during feed-back experiments. Moreover, we calculated the flow rates such that the shear stress for the cells...
in the gradient is within the limits previously demonstrated not to alter the migration of the neutrophils.\textsuperscript{29}

To validate the gradient, we added 1 µM of fluorescein isothiocyanate (FITC) to the chemokine solution (Fig.2C). The chemical gradient was stable over 60 minutes, verified by the analysis of a kymograph demonstrating the stability over time of the fluorescent signal at different points in the gradient (Fig.2D). When we applied a short perturbation to the stage by moving the stage 100 µm the disturbance in the gradient was corrected in less than 30 seconds. The displacement used in this test was at least 100 times larger than the 1µm distance for the fastest neutrophil moving in the 2 seconds between imaging during the experiment, which represents the maximum displacement of the stage at one time point. The stability of the gradient to perturbation is important in order to assure that accurate corrections of stage position do not interfere with the position of the gradient.

We calculated that during the experiments, the majority of tracked neutrophils experience concentrations between 1 and 50 nM of LTB\textsubscript{4}. Studies of binding kinetics in human neutrophils have reported dissociation constant for LTB\textsubscript{4} in the range of 10-15 nM\textsuperscript{30}, suggesting that the receptors are not saturated. In
Suggesting a possible solution to this dilemma, our study provides support to the role of temporal stimuli in neutrophils for enforcing the persistent migration in one direction after the initiation of migration. Unlike bacteria, which start moving in random directions upon stimulation, neutrophils can also take advantage of a spatial sensing mechanism and orient their migration in the direction of higher concentration.

The interplay between spatial and temporal stimuli during neutrophil chemotaxis suggests that the molecular mechanisms of cell migration combine the ability to compare different levels of receptor stimulation in different regions of the cells, with a dynamic memory for the levels of stimulation at different time. Such models consider not only the requirements for symmetry breaking in the presence of a gradient and incorporate stochastic and transient features that benefit from temporal concentration changes around the cells. Additional cues for the molecular substrate of temporal sensing may come from observations of neutrophils that display persistent migration inside small channels in the presence of constant, polar stimulation or even in the presence of decreasing concentrations during retrotransit. During the migration inside channels, the mechanical confinement may compensate for the absence of temporal stimuli, possibly by elements of the cytoskeleton e.g. microtubules which are maintained in a stable configuration inside the small channels.

In the future, the treadmill technology for cell migration will facilitate the study of cell motility and open new opportunities for understanding the effects of temporal changes on motile cells. Historically, feed-back based systems have enabled critical insights into important biological processes, including the propagation of electrical potential while the decoupling of tonic and length effects on the muscle activity, led to better understanding of the mechanisms of actin-myosin contraction. Similarly, clamping spatial and temporal chemotactic gradients while exposing cells to other manipulations can provide new insights into the molecular mechanisms that drive neutrophil chemotaxis. Ultimately, identifying these motility mechanisms could create new opportunities for effective treatments targeting the trafficking of white blood cells through the body in acute and chronic inflammation.

Conclusions

We designed a system to decouple the spatial and temporal gradients during cell chemotaxis. We found that temporal gradients are responsible for the persistence of human neutrophils migration in the response to chemical gradients. Our findings could help understand the mechanisms that guide the neutrophils to sites of infection or inflammation.

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Notes and references


