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# On-chip cell manipulation and applications to deformability measurements

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#### **Abstract**

Active microfluidics for the applications to cellular deformability measurements is an emerging research field ranging from engineering to medicine. Here, we review conventional and microfluidic methods, and introduce an on-chip cell manipulation system with the design principle of fast and fine cell manipulation inside a microchannel. In the latter part of the review, we focus on the results of red blood cell (RBC) deformability measurements as one of the most frequently studied non-adherent cells by on-chip methods. The relationship between mechanical properties and biological structures/features, as well as medical/diagnostic applications, are also discussed.

**Keywords:** Lab-on-a-chip, Microfluidics, Cell mechanics, Deformability, On-chip manipulation, Diagnosis

#### Introduction

Applications of the biological mechanics to the engineering issues has been one of the frontier topics in the research fields of mechatronics and robotics. Living organisms are flexible in shapes and accurately functionalized in association with the sophisticated structures and metabolic energies generated by consuming adenosine triphosphate (ATP). The minimum, microscopic component of the living organisms is a single cell. Even in the single-cell level, cells exhibit typical functions such as energy transductions, motility in response to the stimuli, adaptation of the shapes and internal states to the surrounding environment, and replication of themselves [1]. Considering that typical cells are under a microscopic aqueous environment, it is surprising that they precisely control these functions using tiny molecular machineries against thermal fluctuations.

Cellular deformability is essentially important to realize the various cellular functions. In the viewpoint of the mechanical properties, the cells exhibit both elasticity and viscosity, which exert restoring forces to their original undeformed shapes and frictional forces against

the shape changes, respectively. The typical elasticity (Young's modulus) of a cell is on the orders of Pa–kPa, and the corresponding typical force range for cellular deformation is on the order of piconewton [2]. Owing to the deformability, the mechanical aspects of the cells can be classified into "soft materials".

Typical assays for the analyses and evaluations of biological materials are performed in a petri dish or a microwell plate under a microscope. According to the developments of the experimental techniques to treat such small and soft objects, various methods have been invented to quantify the mechanical properties of a single cell. Conventional methods for measuring the cell mechanics are, for example, atomic force microscopy (AFM) [3-6], optical tweezers [7, 8], magnetic forces [9–11], fluctuating spectrum analysis (flicker spectroscopy) [12-14], and particle-tracking microrheology [15-18], which will be explained later in detail. During the last two decades, microfluidic devices and the related experimental techniques have also been intensively developed along with the maturation of nanoscopic and microscopic fabrication technologies. Recently, the microfluidic techniques have been utilized as fundamental experimental tools to treat small amount of fluids, molecules, particles, and cells in the vast research topics in robotics, mechatronics, science, pharmacy, and medicine. All of above-mentioned

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measurement methods have both advantages and disadvantages, e.g., AFM provides rich viscoelastic information based on nanoscopic probe deflection but takes much long time to perform the measurements. In contrast, the microfluidic devices enable high-throughput measurements but provide less information such as the aspect ratio of the deformed shape, which has no information with physical units. In a similar manner, each method is developed under the trade-off relationship between the throughput and information content [19].

In this review, we describe recent developments of microfluidic technology for measuring cellular mechanics, and also recent efforts for overcoming the trade-off between the throughput and information content. In the following, we first review the conventional methods for the measurements of cellular mechanical properties. Next, the microfluidic techniques are reviewed from the viewpoint of the methods with passive flow and with actively controlled flow. In particular, we explain the details of the active control techniques, where we can impose controlled mechanical stress to a single cell through the integration of an actuator and a high-speed vision into the microfluidic platform, called an on-chip manipulation system. We describe the design principles for the fast and fine cell manipulation inside a microchip, and show how such interdisciplinary collaboration between mechanical engineering and biological materials reveals novel aspects of cell mechanics. In addition, we discuss the relationship between the obtained mechanical characteristics and the biological structures. Finally, toward medical applications, we remark potential diagnoses of diseased cells with case examples.

## Measurement methods of cellular mechanical properties

In this section, we review conventional methods for measuring the cellular mechanical properties. Figure 1 shows the schematics for the typical conventional methods, while the actual devices and experimental setups for these measurements highly depend on the cases. To measure the elasticity and/or viscosity of a microscopic material, in general, either a sensitive force sensor or a sensitive displacement sensor is necessary. Namely, we have to apply a precisely controlled small force and measure the corresponding small displacement, or have to apply a precisely controlled small displacement and measure the corresponding small reaction force. From the measured dynamic stress-strain relationship, viscoelastic coefficients are obtained. Since different types of the measurement methods have different spatial resolutions, time resolutions, throughput, advantages, and disadvantages, a variety of studies with various setups and equipment have revealed the different aspects of the cellular mechanical properties.

In AFM measurements of a microscopic soft materials, the small, sensitive probe is a cantilever, whose nanoscopic deviation can be detected by laser beam deflection. Figure 1a shows a schematic illustration of the measurement principle of AFM. Viscoelasticity measurement by AFM is performed by applying a known indentation pattern to the sample and detecting the cantilever deflection, which reflects the reaction force. The amplitude of the deflection and the delayed responses provide the elastic and viscous information, respectively. By scanning over the sample surfaces, two-dimensional viscoelasticity maps are obtained. Whereas the outputs of an AFM measurement contain full information

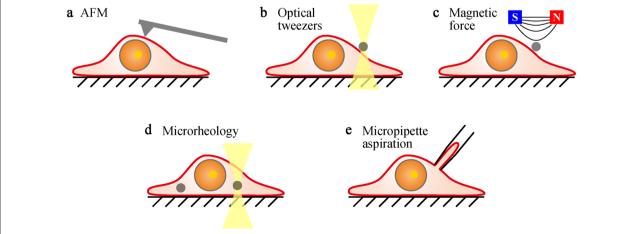


Fig. 1 Conventional measurement methods of cellular mechanical properties. a AFM. b Optical tweezers. c Magnetic tweezers. d Passive microrheology (left particle) and active (right particle with optical tweezers) microrheology. e Miropipette aspiration

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of viscoelastic coefficients with high spatial resolution ( $\sim$  nm), the typical throughput is low ( $\sim$  10<sup>-3</sup> Hz) since the setup and scanning are time-consuming [2, 19, 20]. In addition, only nanoscopic viscoelasticity is accessible since the applied deviation by a cantilever is localized in a nanoscopic length scale.

In the methods with optical or magnetic tweezers, the probe is a small particle attached onto the cell surface. Figure 1b, c show schematic illustrations of the manipulation of a particle attached onto the surface of a single cell by optical and magnetic tweezers, respectively. In the case of optical tweezers, the particles are typically made of silica or polystyrene with high refractive index, and manipulated by radiation pressure of a focused laser beam. From the displacement of the particle from the focused center and spring constant of the trap force obtained in calibration setup, the particle displacement and the restoring force are quantified, resulting in the viscoelastic coefficients. The basic concept is the same in the methods with magnetic tweezers and other types of methods with magnetic fields. In those cases, the magnetic particles are used and manipulated by an external magnetic field. These methods also provide the viscoelastic coefficients with a good spatial resolution (~µm), and the throughput is better than AFM ( $\sim 10^{-1}$ – $10^{-2}$  Hz) [2, 19, 20]. If the tracer particles are injected into the cytosol rather than attached onto the cell surface, these methods are often called particle-tracking microrheology.

For the measurement of cytosolic viscoelastic properties, particle-tracking passive microrheology is another typical class, which utilizes the thermal fluctuation as a force probe. Figure 1d shows the representative image for the particle-tracking microrheology. By measuring the thermal deviation of a tracer particle under constant temperature condition, the viscosity of the surrounding medium can be estimated through fluctuation-dissipation theorem [21]. In the similar principle, shape-fluctuation analysis, conventionally termed as flicker spectroscopy, has been also developed since 1975 [12] to evaluate the membrane bending rigidity, surface tension, and viscosity [13]. Since the typical thermal energy under room temperature is small as  $\sim 4 \times 10^{-21}$  J, this method is applicable only to extremely soft objects such as red blood cell (RBC) with Young's modulus of the order of tens of Pa [7, 22]. The remarkable advantage of the shape-fluctuation analysis is non-invasiveness; all we need in the experiment is to observe the thermal fluctuation under a resting state. The spatial resolution is in the optical limitation (~µm) and the throughput is intermediate ( $\sim 10^{-1}$ – $10^{-2}$  Hz), which are comparable to the particle-tracking methods.

In the last part of this section, we mention the micromanipulation techniques such as micropipette aspiration [22–24] or object handlings by microneedles [25], microknives [26], and microhands [27–30]. For more details of the nano/microrobots for the single cell analyses, see a comprehensive review [31]. Figure 1e shows the schematic image of the micropipette aspiration. The micromanipulation techniques are usually adopted for microinjection experiments, where a single cell is held by capillary suction and reagents are injected into the cytosolic part through another capillary. In the micromanipulation, the cells are directly contacted by a probe, a microneedle, a microknife, or a microcapillary, under a microscope. The probe is controlled by a macroscopic actuator called a micromanipulator. Micropipette aspiration has been intensively used for evaluation of cellular surface tension through the measurement of the negative pressure to keep the suction length. While the spatial resolution is in the size of a single cell, i.e.,  $1-10 \mu m$ , information content is relatively less compared to AFM [2, 19, 20]. The throughput is at the similar level to that of AFM, because the micromanipulation also needs the careful handling of a cell one by one under a microscope. Recent studies have developed the micropipette aspiration toward automation [32]. Recent developments of microhands are also remarkable; microhands and/or microfingers that are realized by actuating several needles simultaneously by piezo electric devices are being developed [27-30].

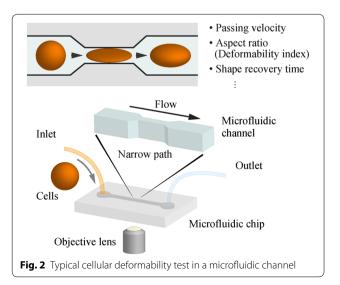
#### Passive flow in microfluidics

Along with the improvements in nano/microfabrication and developments of the research field of Micro Electro Mechanical Systems (MEMS), microfluidic techniques have been utilized to measure the cellular mechanical properties. The microfluidic approaches greatly increase the throughput compared to the conventional ones [19]. A typical microfluidic method for the measurement of single-cell mechanics is to evaluate the shape deformation under a shear flow in a microchannel. This strategy is advantageous to the throughput (typically  $10^3$ – $10^4$  cells per second), the reduction of sample volumes (typically less than 1 mL), as well as integration of other processes such as size sorting. RBCs are one of the most successful and intensively studied subjects in the history of this field, as their physiological situation, flowing in a narrow blood vessel [33, 34], can be mimicked as the flow in a microfluidic channel. In the same reason, other types of non-adherent cells such as other blood cells [35, 36] and other eukaryotic cells such as circulating tumor cells (CTCs) [37, 38] are also suitable for the microfluidic experiments.

For the applications to the measurement of RBC mechanics, Brody et al. reported the deformability test performed in a microchannel fabricated by

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the semiconductor processing techniques [39]. They observed the characteristic folded shape (like "hot-dog bun") of a deformed RBC when it passed through the 4 µm width channel, and measured the passing speeds for various channel widths. The large dispersion of the data was interpreted to the heterogeneity among the individual RBCs. From the second half of 2000, many groups have started to report the microfluidic measurements of single-RBC mechanics. Most popular strategy was the quantification of the passage through a narrow channel under a constant pressure difference between the inlet and the outlet as shown in Fig. 2 [40-45]. Note that the widths of the narrow channels used here were comparable or less than the size of a single cell to confine the degree of freedom of the cell motion to one-dimensional line for the simple and defined experimental situations. In this context, various biological and mechanical aspects have been quantified: ATP-release under wall shear stress [46], passing velocity through the narrow part [43] and the channel-width dependence [45], aspect ratio [47], circularity [48, 49], elastic constants [49-51], and viscoelastic recovery time [52]. In those studies, RBCs exhibit stiffness (shear modulus) of the order of  $10^{-6}$  N/m, time constant of the order of 0.1 s for shape recovery, and large dispersions of the measured values as their typical mechanical responses. As the nonlinear responses, the stiffness is increased with higher strain rate [50] or with a longer storage period [51], and the shape recovery time is typically reduced under ATP depletion [52]. Since different stress conditions induce different types of deformation, the various studies have revealed different aspects of the cellular deformability, e.g., two different orders of shape recovery time have been observed for combined twisting and folding deformation [52]. While

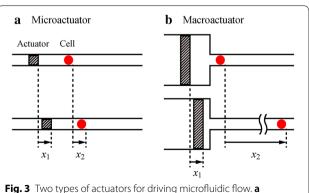


the passive microfluidics has been highly successful in these two decades, it has suffered from less information content in the output of the experiment compared to the those in the conventional methods. The disadvantages in passive microfluidics mainly come from the trade-off accuracy against high throughput. Also, the small and closed space in a microfluidic channel has limited the evaluation methods, typically only to the shape visualization by a high-speed camera. For the precise evaluation of the detailed mechanical properties, active control of the experimental parameters is necessary. In this context, researchers have developed on-chip manipulation systems shown in the following section.

#### **Active control in microfluidics**

The protocols for the active control of the experimental parameters, namely, precise applications of a specified stress or deviation to a single cell in a microchannel, have been recently developed. In this review, we call this technique "on-chip cell manipulation". To realize the on-chip cell manipulation, the two mechatronics components should be equipped: an actuator to drive the cell motion and a sensor for tracking the cell position or state.

As for the actuator equipped on a microchannel, both microscopic and macroscopic actuators have been used. Here, the terms microscopic and macroscopic mean the length scales for a single cell and a macroscopic tube or syringe, respectively. Microactuators and macroactuators have both advantages and disadvantages from the viewpoint of the on-chip cell manipulation. Let us suppose the typical situation of a single-line microchannel shown in Fig. 3. In the case of a microactuator, the spatial resolution of the cell motion is the same as that of the actuator, which is advantageous for the simple, fine manipulation. However, the fabrication cost is high, and the microchip including the microactuator should be discarded once the channel clogging happens. In the case of the



**Fig. 3** Two types of actuators for driving microfluidic flow. **a** Microactuator. **b** Macroactuator. The hatched parts represent the actuators

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macroactuator, on the other hand, the microchip itself contains no expensive parts, and is cheap and disposable. Thus, the clogged microchip is easily replaced by a clean one with very low cost. However, the spatial resolution of the cell motion is much low due to the huge cross-sectional-area ratio of the actuator to the microchannel. The typical ratio is over one million, which results in the loss of fine manipulation due to the million-times increase in the deviation and the velocity. Sakuma and the coauthors discussed the velocity-increase issue and proposed a possible solution called "virtual reduction gear" as schematically shown in Fig. 4 [53]. The virtual reduction gear is a macroscopic elastic part whose spring constant is represented by k. For incompressible fluid, the volume conservation and the force balances for the target cell and the elastic part are given by

$$A_1\delta_1 = A_2\delta_2 + A_3\delta_3$$

$$A_2p=c\dot{\delta}_2$$

$$A_3p = k\delta_3$$
,

where  $A_i$  is the cross-sectional area for the i-th part  $[i=1 \pmod{i}]$  (macroactuator), 2 (target cell), and 3 (elastic part)],  $\delta_i$  is the displacement for the i-th part, and c is the frictional coefficient of the flowing target cell. Here, even under high pressure, the microfluidic flow is a laminar flow due to the large shear stress from the wall, and therefore, the pressure is constant during the sampling interval. These

equations can be solved under the constant-pressure assumption and the initial condition  $\delta_2(t=0)=0$  under the step input of the deviation  $\delta_1$  at t=0 as

$$\delta_2(t) = \frac{A_1}{A_2} \delta_1 \left[ 1 - \exp\left\{ -\frac{k}{c} \left( \frac{A_2}{A_3} \right)^2 t \right\} \right].$$

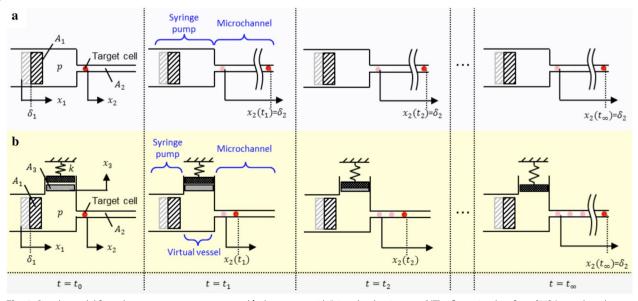
If we consider the motion of the target cell at the initial stage ( $t \approx 0$ ), which is within a single sampling step  $\Delta t \approx 0$ , the initial response of the target cell reads

$$\delta_2(\Delta t) pprox rac{k}{c} rac{A_1}{A_2} igg(rac{A_2}{A_3}igg)^2 \delta_1 \Delta t.$$

In this regime, the reduction ratio between the motions of the actuator and the target cell can be defined as  $\delta_2/\delta_1$  and thus

$$\frac{\delta_2(\Delta t)}{\delta_1} pprox \frac{k}{c} \frac{A_1}{A_2} \left(\frac{A_2}{A_3}\right)^2 \Delta t$$

is obtained. The positioning resolution is improved if the right-hand side is less than 1, and it is the case of the macroscopic actuator. For example, a piezo electric actuator is a commercially available macroactuator, whose cross-sectional diameter is on the orders of mm and produce a high-frequency characteristic of 10 kHz. If the piezo electric actuator is connected to a microchannel with a cross-sectional diameter of 10  $\mu$ m, the factor of  $(A_2/A_3)^2$  becomes  $10^{-10}$ , indicating the drastic reduction



**Fig. 4** Simple model for **a** the macroactuator system and **b** the system with "virtual reduction gear" (The figure is taken from [53] (reproduced under CC BY-NC-SA 4.0, see the reference for details))

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effect of the deviation, i.e., the drastic improvement in the positioning resolution.

Even though the theoretical evaluation is 1 m without the virtual reduction gear, we could confirm a high positioning resolution of 240 nm in our experimental system composed of a piezoelectric actuator driven in  $\Delta t$  of the order of ms and a PDMS microchip with a microchannel of 10 µm width, where the wide inlet area for tubing plays a role of the virtual reduction gear [53]. Note that the 240 nm is a pixel resolution of the vision system, which is the bottle-neck of the positioning resolution worse than the theoretical value derived above. Figure 5 shows an example of open-loop frequency characteristics of the on-chip manipulation system [54], where the gain characteristics shows a typical integral form, and the phase characteristics shows 180° delay under the frequency of 100 Hz. This frequency characteristics confirms the first order system under the position-feedback loop. In general, while the integral-formed open-loop characteristics can keep stable behaviors even in high frequencies, the delay in the system can cause the instability in that frequency region. A key remark on the on-chip cell manipulation by using a microfluidic channel is that a fast and fine manipulation can be achieved by combining a macroactuator and a reduction system to drive the flow inside a microfluidic channel.

Developments of this on-chip manipulation system and the evaluations of the characteristic mechanical properties of RBCs have been performed mainly by the authors' group. Sakuma and the coauthors performed fatigue test, where a RBC was manipulated to pass through a narrow constriction repeatedly over 1000 times at ~1 Hz, and the number of passage until the loss of its extensibility and recoverability was used for the index of deformability [55]. Such long-time loading applied inside a microfluidic channel was the first attempt in this field. Ito and coauthors have further investigated the effect of long-time loading to a RBC and/or an eukaryotic cell, which exhibit a nonlinear mechanical response against different loading time [56-59]. Here, the combination of the high-speed feedback control of the cell position and the geometrical constriction worked like a microfluidic hand, and the cell shape was kept folded and elongated for a desired time period. These techniques enabled the on-chip quantification of the cellular viscous information, where the control of the deformation time is required. This point is the qualitative difference from passive microfluidic techniques, where the cells rapidly flow out of the view under a constant driving pressure. As a result of the loadingtime dependence, the shape recovery of a RBC after loading became slower with the increase in the loading time [57]. Similar behaviors were observed also in a fibroblast

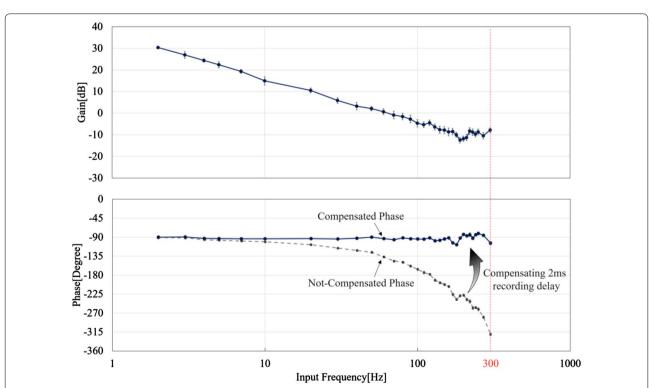


Fig. 5 Example of frequency characteristics of the on-chip cell manipulation system (The figure is taken from [54] (reproduced under CC BY-NC-SA 4.0, see the reference for details))

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cell, a kind of eukaryotic cell [59]. Assuming a viscoelasticity composed of linear springs and dampers, the shape recovery time does not depend on the loading time in theory. In contrast, the experimentally measured values exhibited strong dependence on the loading time as well as the amount of ATP. The discrepancy to the linear viscoelasticity theory and the ATP-dependence should reflect special internal structures of the cell, which will be discussed in the next section.

In the on-chip manipulation system, the deformability measurement is performed only with photographs taken from a high-speed camera, displacement of a piezo electric actuator, and microstructures in a microchannel; no force sensor is equipped. Therefore, the typical output is deformability index (aspect ratio) [55] or the ratios between mechanical parameters [57]. In other words, the physical unit of force "N" lacked in the deformability measurement with the on-chip manipulation system. To overcome the limitation and obtain the full information of elastic and viscous coefficients, many efforts have been recently made [60-64]. The basic strategies can be classified into two concepts: (1) integration of the fluctuation analysis or (2) quantification of hydrodynamic force. (1) Integration of the fluctuation analysis was achieved by utilizing the on-chip cell manipulation, which enables to keep the cell position constant inside a microchannel. Ito and the coauthors compared the surface tension, bending stiffness, and viscosity with the parameter ratios obtained in the shape recovery, and found negative/positive correlations between them, indicating how the unit of force should be related with the assumed springs and dampers [60]. (2) The quantification of a hydrodynamic force was challenged with a support of a computational simulation. Kirimoto and the coauthors experimentally observed the flow profile surrounding a flowing RBC, and estimated the viscous stress on the surface of a RBC. Using the onchip manipulation, they measured step response [61] and dynamic responses of the amplitude and phase to a sinusoidal input [62, 63], which provided the effective Young's modulus and viscosity consistent with the other conventional measurements [7, 22].

In the end of the section, we mention the on-chip manipulation system with other setups. Guo and the coauthors have reported an active pressure control system for microchannels, and developed microfluidic pipette aspiration techniques for measuring the single-cell deformability [65, 66]. In their system, the pressure attenuator composed of a parallel long fluidic circuit is implemented and controlled from a program code. Their design demonstrated the  $10^{-2}$  reduction of the externally applied pressure, and succeeded in the precise cell positioning. Compared to this work, the remarkable feature of our on-chip cell manipulation system is the

high-speed, realtime, and thus spatio-temporally precise feedback position control. The high-speed manipulation allows the evaluation of the step response and hydrodynamic shear stress strong enough to deform a cell. On the whole, we believe that the next-generation microfluidics will develop with these emerging techniques for precise control and measurement in a microchannel.

## Specific features of cellular mechanics: loading effect

In the previous section, we introduced the on-chip manipulation system and the results of the deformability measurement. For deeper understanding of the mechanism of the nonlinear deformability that depends on the loading time and the metabolic energy (amount of ATP), we need to see the internal structure of the cell.

The microfluidic platforms are especially suitable for non-adherent cells since these cells are suspended in an aqueous solution and thus the mechanical properties under natural condition can be measured. The most typical examples of non-adherent cells are blood cells: RBCs, white blood cells (WBCs), and platelets. They occupy about 40% volume of the whole blood, and flowing inside blood vessels. Since the RBCs occupy about 96% volume among the blood cells, RBC mechanics and deformability have been regarded as the most important factor to characterize the rheology of the blood. Actually, the RBCs easily deform during the blood circulation, where they are exposed to wall shear stress and spatial confinement inside the blood vessels. Since the dimension of a RBC, 8 μm in diameter and 2 μm in thickness [34], is larger than the smallest blood vessels, they experience large deformation during the microcirculation. Such deformability is the physiologically essential property of RBCs to realize the smooth microcirculation.

Compared to eukaryotic cells, the internal structure and functions of a RBC are much simpler; it has neither nucleus nor organelles, and the cytosol mainly consists of dense hemoglobin solution, sometimes regarded as just a bag of hemoglobin [39]. The simpler cytosol with no large structures is actually advantageous for the large deformation of a RBC. In addition to the cytoplasmic structure, the cytoskeleton is also different from that of typical eukaryotic cells in both the protein component and the higher-order network shape; it mainly consists of filaments formed by the tetramers of spectrin proteins, which are connected to the cell membrane via the short actin chain and various membrane proteins. The overall structure of the cytoskeletal filaments in a RBC is the hexagonal network pinned underneath the cell membrane [67, 68]. The cell membrane of a RBC is also an important structure to ensure the bending stiffness and keep almost constant surface area of the cell. It Ito and Kaneko Robomech J (2020) 7:3 Page 8 of 11

mainly consists of lipid bilayer membrane and embedded additional membrane proteins such as ion channels, ion pumps, molecular sensors, and linkers to other proteins. The typical value of bending stiffness is small as  $10^{-19}$  N m [13], which is similar to that of pure lipid bilayer membrane, and thus the large folding deformation is allowed. On the other hand, the typical value of the area expansion modulus is much larger as  $10^{-1}$  N/m [69], which is 6 orders of magnitude larger than the bending stiffness in the same length-scale deformation. Thus, the RBC membrane is easily bent by keeping the surface area when it is exposed to the mechanical stresses. For the viscosity of the deformation, the membrane viscosity with a typical value of  $10^{-6}$  N s/m is known as the dominant factor [70].

While the above structures represent the static mechanical properties of a RBC, the RBC also exhibit ATP-dependent mechanical responses, which is the characteristic feature of living materials. The metabolic functions in a RBC are known to be attributed to the phosphorylation of various proteins such as protein 4.1 [71], band-3 [72, 73], ankyrin [74], actin [75–77], myosin [78], and spectrin [79]. Although the whole cell mechanics is complicated and the exact details for the ATP-dependent deformability is still unclear [57], future experiments with inhibitions of specific protein activities or knock out samples will contribute to deeper understanding and applications to novel mechanisms investigated in robotics and mechatronics.

#### **Medical applications**

Finally, in this section, we remark about the applications of the cellular deformability measurements to medical and diagnostic fields. Up to here we introduced various mechanical properties ranging from the aspect ratio to the viscoelastic coefficients such as bending stiffness, area expansion modulus, shear modulus, membrane viscosity, cytosolic viscosity, and Young's modulus. These values and their specific dependences on deformation amplitude, period, frequency as well as ATP amount, can be used as biomarkers for the evaluation of the pathological conditions of the cell. For these purposes, a number of studies have reported that the mechanical properties of a single cell are altered, and often loses the flexible deformability, under diseased states. In the following, we briefly introduce typical blood diseases related to the modifications of RBC deformability and typical examples of microfluidic investigations for the diseases.

Sickle cell disease is an example of hereditary disorders of RBCs, in which genetically mutated hemoglobin (sickle hemoglobin; HbS) forms abnormally polymerized aggregations, and causes disorders in  $\rm O_2$  transport, leading to anemia. Such RBCs have a sickle shape and exhibit

more rigid and viscous mechanical property [80]. Thus, in addition to the reduced  $\mathrm{O}_2$  transport by hemoglobin mutation, they also tend to disrupt the smooth microcirculations of the blood itself. Microfluidic channels have been used for evaluation of the sickle cell disease. For example, a microchannel that mimics a physiological vascular network has been used to evaluate the experimental parameters such as driving pressure and oxygen concentration for vaso-occlusive events [81].

Infection to malaria species such as *Plasmodium vivax* and Plasmodium falciparum is also a widely known disease for RBCs. As the infected malaria parasite in a host RBC matures in a 48-h cycle from ring forms to trophozoites and schizonts, the healthy biconcave cell shape is modified and the flexibility is decreased [82, 83]. These changes also depend on the four species of malaria [84]. Using microfluidics, Handayani and the coauthors studied the passage ability of Plasmodium vivax-infected RBCs through a microfluidic channel with 2 µm width, and found that the successful transit rate decreased according to the maturation of malaria-infection states [83]. For Plasmodium falciparum, Bow and the coauthors demonstrated the high-throughput screening and diagnosis of a small population of ring-stage infected RBCs by measuring the passing velocity of blood cells through a microfluidic constriction [85].

Sepsis is known as one of blood-related diseases that cause systematic inflammatory responses [86]. The septic shock is induced by the lipopolysaccharides (LPSs) released from the outer membrane of Gram-negative bacteria [87]. Many reports have suggested that LPSs cause the stiffening of RBCs, and disturb the smooth microcirculation [88–90]. Ito and the coauthors performed the measurements of the alteration of mechanical properties using microfluidic platforms, where they found the shear modulus of RBCs exposed to LPSs became larger, and RBCs exhibited shorter recovery time compared to that in healthy RBCs [57].

The patients need correct, accurate and fast decision-making and treatments as much as possible. When microfluidic devices are used for medical and diagnostic purposes, both the information content and throughput of the assays are critically important. In this sense, the developments of next-generation microfluidic techniques that achieve both better readouts and higher throughput are expected in this fields. In addition, more improvements in the user interface of microfluidic devices and software are also important requirements for the usage in the clinical situations by clinical doctors, not only by engineers in laboratories. In this paradigm, automation of both the hardware and software is another important topic to be addressed, and has been intensively investigated [91–95]. For the on-chip cell manipulation, we are

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also developing the automation of the gain-tuning toward clinical usages [96]. Although these requirements seem to be mature in macroscopic robotics such as in robot-assisted treatments by the da Vinci surgical robotic system (Intuitive Inc.) and robot-assisted biological assays by Mahoro (Robotic Biology Institute Inc.), microfluidic tools for biological materials are still in an emerging stage.

#### **Conclusions**

In this review, we summarize the experimental techniques for the measurements of cellular deformability, especially focusing on microfluidic techniques of RBC deformability evaluations. While passive microfluidics that drives the channel flow at a constant flow rate has been widely used for the deformability test in various research fields, active microfluidics that controls the flow and the suspended object in a realtime way has been recently developed, by combining robotics and mechatronics with the microscopic biological materials.

The desired control of the positioning of a target object is a universal requirement for various processes to treat a single cell. In this context, the research scope of the onchip cell manipulation techniques in actively controlled microfluidics is still expanding. Not only to improve the performance but also to overcome the existing qualitative limitations, the technological aspect is being developed by incorporating modern technologies such as artificial intelligence (AI) and automation. If such programmable or automated on-chip manipulation is integrated, for example, into the organ-on-chip systems, it might realize the "on-chip printing" of organ structures by distinguishing the deformability of individual stem cells, which has a great impact on the fields of biotechnology and medicine. In the interdisciplinary research fields ranging from engineering, science to medicine, we believe that robotics and mechatronics play key roles to develop novel measuring tools and overcome the conventional limitations. In this sense, the microfluidic measurements of cellular deformability are the frontier where biological materials and robotics/mechatronics meet and integrate each other.

#### **Abbreviations**

MEMS: micro electro mechanical systems; RBC: red blood cell; WBC: white blood cell; HbS: sickle hemoglobin; CTC: circulating tumor cell; LPS: lipopolysaccharide.

#### Acknowledgements

This work was supported by JSPS KAKENHI Grant Numbers JP19H00749, JP19K14675, and by Sumitomo Foundation (No. 181161).

#### Authors' contributions

HI and MK contributed to the conception of the review, and writing the final manuscript. Both authors read and approved the final manuscript.

#### Fundina

Not applicable.

#### Availability of data and materials

Not applicable.

#### **Competing interests**

The authors declare that they have no competing interests.

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Received: 24 October 2019 Accepted: 3 January 2020 Published online: 13 January 2020

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