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On the near-wall accumulation of injectable particles in the microcirculation: smaller is not better

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Although most nanofabrication techniques can control nano/micro particle (NMP) size over a wide range, the majority of NMPs for biomedical applications exhibits a diameter of ~ 100 nm. Here, the vascular distribution of spherical particles, from 10 to 1,000 nm in diameter, is studied using intravital microscopy and computational modeling. Small NMPs (≤ 100 nm) are observed to move with Red Blood Cells (RBCs), presenting an uniform radial distribution and limited near-wall accumulation. Larger NMPs tend to preferentially accumulate next to the vessel walls, in a size-dependent manner ($\sim 70\%$ for 1,000 nm NMPs). RBC-NMP geometrical interference only is responsible for this behavior. In a capillary flow, the effective radial dispersion coefficient of 1,000 nm particles is ~ 3 -fold larger than Brownian diffusion. This suggests that sub-micron particles could deposit within diseased vascular districts more efficiently than conventional nanoparticles.

Over the last 20 years, a plethora of nano/micro particles (NMPs) have been engineered, characterized and developed for the early detection, imaging and treatment of cancer and other diseases^{1,2}. These carriers of therapeutic and imaging agents are sufficiently small to be systemically injected and transported by the blood flow, and can virtually reach any vascular district and tissue within the body. Different NMP sizes, surface properties and shape combinations – the 3S parameters in the design of NMPs – have been tested with the objective of improving the delivery efficiency, that is to say the percentage of injected agents carried at the biological target as compared to the original, total administrated dose. This has led to developing NMPs with a characteristic size ranging from a few nanometers, as in the case of dendrimers³, up to a few micrometers^{4,5}; with a surface charge varying from negative to positive and neutral, as for NMPs decorated with poly(ethylene glycol) (PEG) chains^{6,7}. More recently, the NMP shape has been recognized as a critical determinant in regulating i) the vascular transport^{8,9}; ii) cellular uptake^{10,11} and iii) differential organ accumulation¹². Thus, in addition to the spherical shape, cylindrical, hemispherical and discoidal NMPs are being investigated^{12–15}. Despite all this, the percentage of injected NMPs accumulating at the biological target is still unsatisfactory low.

Systemically injected particles have to overcome a complex series of biological barriers before reaching their target^{16,17}. From the site of administration, these barriers include i) the transport within the blood vessels where NMPs interact with several circulating cells, including the most abundant red blood cells (RBCs); ii) the sequestration by circulating monocytes and macrophages residing in the liver and spleen; and iii) the diffusion across the intricate tumor matrix while seeking abnormal cells. Each of these barriers reduces the NMP dose eventually reaching the biological target by unspecific sequestration and hijacking¹⁸. The use of stealth coatings, such as PEG chains, has increased significantly the average circulation times of NMPs, from minutes up to several hours, by providing a temporary shield against macrophage recognition and uptake⁶. Sufficiently small NMPs, exhibiting a characteristic size up to a few tens of nanometers (< 50 nm), such as dendrimers and micelles, have been shown to penetrate hundreds of microns deep into the tumor tissue^{19,20}, as well as in organs with highly fenestrated vessels (i.e. liver, spleen, lungs and bone marrow)²¹. Discoidal particles have demonstrated advantages in navigating and targeting the diseased vasculature, as compared to traditional spherical particles^{5,15}. Although some

work has been developed on the interaction between RBCs and micron-sized spherical beads^{22–24}, a comprehensive understanding of the interplay between RBCs and NMPs, in the classical size range for intravascular applications, has been so far overlooked.

Blood is a complex fluid comprising an aqueous solution rich in different molecules and proteins – the plasma – and cells – RBCs, white blood cells (WBCs) and platelets. The RBCs are the most abundant accounting for 30 to 50% of the overall blood volume; followed by WBCs with about 1% and platelets at percentages much smaller than 1% of the blood volume. Because of their deformability under flow and biconcave shape, RBCs are confined within the core of the blood vessels and have circulation times of several weeks^{25,26}. On the other hand, WBCs and platelets are required to interact frequently with the blood vessel walls searching for vascular abnormalities. Indeed, these are the features that optimally designed NMPs should also exhibit in order to identify vascular fenestrations and sense for the expression of disease-specific vascular receptors. Interestingly, the RBC confinement in the vessel core regulates and promotes the interaction of WBCs and platelets with the vessel walls. WBCs are twice as big as RBCs and are pushed laterally by the fast moving RBCs so that WBCs can roll and eventually adhere to the vessel walls in the inflamed microcirculation^{22,23}. Differently, platelets are three times smaller than RBCs and, since they cannot penetrate the vessel core densely packed with RBCs, are kept constantly in close proximity of the vessel walls²⁷. Inspired by these two examples, delivery efficiency could be enhanced by designing NMPs that would fully exploit the presence of RBCs in a capillary flow^{24,28}.

This work analyses the transport of NMPs in the microcirculation and their interaction with circulating RBCs. The vascular radial distribution of 200 and 1,000 nm fluorescent beads is studied using intravital video microscopy (IVM)²⁹ in the microcirculation of live mice and the Immersed Finite Element Method (IFEM)^{30–32} to model the transport of NMPs in a capillary flow. Different levels of hematocrit (i.e. the volume percentage of RBCs in blood) are considered ranging from sub-physiological (0 and 15%) to physiologically relevant values (30%). RBCs are treated as biconcave deformable vesicles. The NMPs are spherical in shape and their diameter varies from 10 to 1,000 nm, covering the size range of interest to systemic drug delivery and biomedical imaging systems. Finally, the radial dispersion of the NMPs within the capillary flow is estimated as a function

of their size and hematocrit and used as a metric for assessing the likelihood of NMP interaction with the blood vessel walls.

Results

In vivo radial distribution of NMPs in capillary flows. Intravital video microscopy (IVM) was used to monitor the dynamics of 200 and 1,000 nm particles in a live animal. Pegylated fluorescent polystyrene NMPs were injected via tail vein and observed in the microvasculature of the ear of a mouse. The IVM is constituted by a video-rate multiphoton microscopy system that can track flowing NMPs in the bloodstream with a frame rate at 30 Hz (**Supplementary Information**)^{15,29}. Using the video-rate acquisition, NMPs were tracked with velocity up to ~1 mm/s which covered most capillaries and venules in the ear. To study radial distribution of NMPs, postcapillary venules with lumen diameter ranging from 15–30 μ m were considered.

In order to quantify the radial distribution of the circulating NMPs, the longitudinal cross section of the blood vessel was conveniently divided in 5 regions: two outer layers next to the walls and each accounting for 20% of the vessel section (0.0–0.2 and 0.8–1.0); an inner layer whose axis coincides with that of the blood vessel, accounting for 20% of the vessel section (0.4–0.6); and two intermediate layers extending between the outer and inner layers and each accounting for 20% of the vessel section (0.2–0.4 and 0.6–0.8). The number of NMPs moving in each layer divided by the total number of particles counted in the vessel gives the normalized density of NMPs per layer. This parameter was monitored over time for each of the 5 layers and the two different particle sizes. **Fig. 1** summarizes the findings from this in vivo analysis. The NMPs appear as yellow dots on a red background identifying the blood vessel of interest. Extravascular tissue showed blue fibrous structure due to second harmonic generation signal from the collagen. The representative IVM image of **Fig. 1a** shows the 200 nm NMPs distributing quite randomly within the blood vessel without preferential accumulation in any of the 5 layers. This is clearly reflected by the almost uniform normalized density of NMPs over the cross section (**Fig. 1b**) returning a value close to 0.2 for each layers. It is also demonstrated in the **Supplementary Movie S1**. Very different is the behavior observed for the 1,000 nm NMPs. These tend to mostly accumulate in the two outer layers, next to the vessel walls (**Fig. 1c** and **Supplementary**

Figure 1 | Intravital microscopy analysis of the NMP radial distribution. (a) Representative image of 200 nm spherical polystyrene beads (yellow dots) in the postcapillary venule of a mouse ear. (b) Radial accumulation of the 200 nm beads presented as normalized number density. (c) Representative image of 1,000 nm spherical polystyrene beads (yellow dots) in the postcapillary venule of a mouse ear. (d) Radial accumulation of the 1,000 nm beads presented as normalized number density. (e) Trajectory and (f) radial position of 1,000 nm spherical polystyrene beads (yellow dots) in the postcapillary venule of a mouse ear. (bar = 20 μ m).

Figure 2 | Computational domain for the capillary flow simulations. Deformable Red Blood Cells (RBCs) and spherical rigid particles are dispersed within an aqueous solution (blood plasma), filling a $20 \times 60 \mu\text{m}$ capillary. Periodic boundary conditions are imposed at the inlet and outlet sections of the capillary. A parabolic velocity profile is assigned at the inlet section with a maximum velocity of $100 \mu\text{m/s}$.

Movie S2). The bar chart in Fig. 1d quantifies the radial distribution showing that $\sim 60\%$ of the total number of NMPs stays in the two outer layers against a 15% of NMPs residing in the inner most layer and the rest, 30%, in the two intermediate layers (i.e. 15% per each intermediate layer). Thus, the larger NMPs (1,000 nm) are ~ 3 times more concentrated near the vessel walls than the smaller NMPs (200 nm). Fig. 1e shows a typical trajectory in vivo for the larger 1,000 nm NMP: it drifts laterally from its original position in the vessel core to the periphery moving closer to the wall. The variation in radial position of the NMP with time is plotted in Fig. 1f. This shows that the lateral drift is not a continuous process: the NMP moves laterally away from the vessel midline over the first 0.1 sec with a velocity of $\sim 100 \mu\text{m/s}$; then drifts along the flow direction longitudinally with no appreciable radial velocity for about 0.2 sec; and, eventually, turns again towards the vessel wall rapidly moving away from the midline with an average velocity of $\sim 11.7 \mu\text{m/s}$. Such a zig-zag motion with rapid changes in direction should be most likely associated with RBC-NMP geometrical interference.

Predicting the radial transport of NMPs in a capillary flow. To better elucidate the mechanisms regulating the different NMP behaviors observed in the IVM experiments, a computational model is developed within the IFEM^{30–32} to analyze the size-dependent NMP vascular transport. The dynamics of NMPs and RBCs immersed in a blood capillary is followed over time, as schematically shown in Fig. 2. The capillary is a straight tube with a diameter of $20 \mu\text{m}$ and a parabolic velocity profile imposed at the inlet with a maximum velocity of $100 \mu\text{m/s}$. These are typical values for the blood flow in the microcirculation. The vessel is filled with plasma, and RBCs are modeled as vesicles with a hyperelastic membrane containing an aqueous solution similar to plasma. The RBC concentration (hematocrit) varies between 0 and 30%, comparable to physiological values in the microcirculation. NMPs are considered as rigid, spherical beads with a characteristic diameter ranging from 10 to 1,000 nm, having the same density as plasma, to rule out the contribution of the gravitational field. The RBC-RBC and RBC-NMP interactions are accounted for by using interaction potentials with proper coefficients, as described in the Methods and listed in Table 1. Periodic boundary conditions are imposed at the inlet and outlet of the capillary to limit the computational burden, while still considering sufficiently long capillaries. Therefore, RBCs and NMPs are

continuously extracted from the outlet of the vessel and re-introduced at the inlet with the same geometric and kinematic conditions. The total number of NMPs in the capillary is fixed for all the simulations and it is equal to 100. The computational model was validated using four different test cases and comparing the numerical results with experimental data provided in the literature (Supplementary Fig. S1). The 4 test cases are i) the analysis of RBC stretching under uniaxial and transversal tensile forces; ii) the computation of the discharge hematocrit out of a tube; iii) the quantification of the apparent blood viscosity as a function of the RBC volumetric concentration; and iv) the thickness of the cell free layer at different hematocrits. A good agreement is observed between the numerical predictions and the experiments, thus supporting the accuracy and validity of the proposed approach.

The IFEM model is subsequently used to predict the dynamics of NMPs and RBCs in a capillary flow. Representative snapshots at different time points are presented in Fig. 3 for 100 nm NMPs. As time progresses, RBCs and NMPs are transported downstream by the flowing plasma. Note that the problem is coupled in that the fluid velocity affects the motion of the RBCs and NMPs and vice versa, giving a fairly complicated velocity field in the vicinity of the deformable cells and NMPs. In the initial configuration, the NMPs (yellow dots) are randomly distributed within the capillary together with the RBCs, occupying most of the tube volume (Fig. 3a,b). Under flow, RBCs deform and modify locally the flow field affecting the NMP

Table 1 | Parameters used in the IFEM simulation for vascular transport

Parameter	Value
Fluid density	1.0 g/cm^3
Fluid viscosity	$1.2 \text{ g/(m}\cdot\text{s)}$
Cytoplasm viscosity ^{40,41}	$6.0 \text{ g/(m}\cdot\text{s)}$
C_1 for RBC hyperelastic material ^{40,41}	20.0 Pa
C_2 for RBC hyperelastic material	1.0 Pa
D_0 for RBC intracellular interaction	$1.0 \mu\text{m}^2$
r_0^M for RBC intracellular interaction ⁴¹	$0.49 \mu\text{m}$
β for RBC intracellular interaction ⁴¹	$3.84 \mu\text{m}^{-1}$
ε for NMP interaction	$1.0 \times 10^{-12} \text{ J}$
r_0^{IJ} for NMP interaction	1.0 nm

Figure 3 | Simulated distribution of RBCs and NMPs within the capillary. (a) RBCs and (b) NMPs are randomly distributed within the capillary in the initial configuration ($t = 0$ sec). (c) Representative images showing the RBC and NMP distribution within the capillary at different time points during the simulation. The hematocrit is 30% and the number of NMPs is 100. (d) The complexity of the flow field around the NMPs, in proximity of the RBCs.

dynamics (Fig. 3d). This can be readily appreciated in the following insets of Fig. 3 for a characteristic time running from 0.0 to 1.0 sec, and it is also documented in the **Supplementary Movies S3 and S4**. In the same snapshots the circumferential velocity profile is also provided along the capillary with a velocity growing radially from the periphery to the core of the channel. The RBCs deform under flow, are pushed away from the vessel walls and tend to accumulate within the center of the blood vessel. This leads to the formation of a layer near the vessel wall which is depleted of RBCs (The cell-free-layer). The thickness of the cell-free-layer varies with the hematocrit (HCT), diameter of the capillary and mean blood velocity (**Supplementary Fig. S1**).

Considering the same vessel partitioning (5 radial layers) introduced for the IVM analysis, the normalized density of 200 and 1,000 nm NMPs is quantified within the 20 μm tube as a function of time, at 30% hematocrit. The corresponding data are presented in the bar charts of Fig. 4 at 0.0, 1.0, 2.0 and 3.0 sec. At time $t = 0.0$ sec, the NMPs have identical volume concentrations within the 5 layers. As time passes, the NMPs in the inner layers are pushed laterally away from the vessel midline. For the 200 nm particles, the maximum normalized density is achieved in the two intermediate layers where about 27% of the NMPs accumulate, per each layer. In the innermost layer only 12% of the NMPs are left after 3 sec, whereas

about 17% of NMPs are found in the two outer layers, per each layer. For the 1,000 nm NMPs, the observed behavior is very different. These NMPs accumulate equally in the outer and intermediate layers reaching a normalized density of 23% per each of the 4 layers and leaving only a normalized density of 8% in the inner-most layer. Although, the normalized density measured in vivo cannot be precisely recapitulated in silico, the IFEM simulations are qualitatively in good agreement with the in vivo data. For the 1,000 nm NMPs, most of the beads are pushed outwards radially; whereas for the 200 nm NMPs, the beads are remixed within the vessel without showing a clear accumulation at the wall. Also, note that the overall behavior shown within the first 1 sec of simulation is confirmed in the following 2 sec, with slightly different values. This would imply that 1 sec of simulation is sufficient to represent the process, and this time period would correspond to a capillary length of $\sim 100 \mu\text{m}$, given an inlet blood velocity of 100 $\mu\text{m/s}$.

It is important to emphasize that the interaction between RBCs and NMPs is described by using a Lennard-Jones (LJ) potential (see eq. (5) in the Methods section). Thus the charge of the NMPs is not explicitly considered, but it is rather accounted through the LJ potential strength. As such, this interaction force is proportional to the LJ strength parameter ϵ , varies with the separation distance r , and is independent of the NMP size. Most importantly, this force is already

Figure 4 | Simulated radial distribution of the NMPs. The radial accumulation of (a) 200 nm and (b) 1,000 nm NMPs within the cross section of the capillary over time. Initially, the NMPs are equally distributed within the five considered sectors. The hematocrit is 30% and the number of NMPs is 100.

negligible, as compared to the hydrodynamic forces, for separation distances larger than about $r = 10$ nm (10 times r_0 , with $r_0 = 1$ nm). Moreover, Fig. 3d shows the complexity of the flow field around the NMPs, in proximity of the RBCs. The fluid velocity vector has non zero components in the direction normal to the vessel longitudinal axis that are responsible for pushing laterally the NMPs. This would imply that the vascular dynamics of the NMPs is mostly governed by geometrical interference and the resulting local, complex flow dynamics rather than their direct repulsive interaction with the RBCs.

Radial dispersion coefficient as a function of the NMP size. Based on the experimental evidences and the *in silico* data, the RBC- NMP

interaction is size-dependent. Indeed, larger NMP would interfere more with the fast circulating RBCs; whereas small NMPs would more easily find their way within the RBC clusters. It would then be interesting to characterize the lateral transport of spherical beads with varying diameters within whole blood. The dynamics of NMPs with 5 different diameters, namely 10, 50, 100, 500 and 1,000 nm, was studied in whole blood at 30% hematocrit. Note that the vast majority of NMPs developed for systemic drug delivery and imaging have a diameter smaller than or close to 100 nm. The size-dependent NMP behavior is depicted in Fig. 5 which provides the trajectories of individual NMPs with two different initial radial positions: within the cell free layer and the vessel core. The red dashed line in Fig. 5 identifies the cell free layer computed for the current configuration, having a thickness of ~ 3.35 μm . The smallest NMPs, with a diameter ranging from 10 to 100 nm, originally located within the vessel core, tend to drift laterally moving towards the wall and then drifting back towards the midline without abandoning the core (Fig. 5b–d). Differently, larger NMPs, with a diameter ranging between 500 and 1,000 nm, tend to migrate out of the vessel core and accumulate in the cell-free layer, as they interfere more vigorously with the fast moving RBCs (Fig. 5e,f). On the other hand, NMPs initially located in the cell free layer tend to move within this layer and only the smaller NMPs (< 100 nm) could possibly re-enter the vessel core (Fig. 5b–f, Supplementary Fig. S4). In order to better emphasize the role played by RBCs, the same simulations were performed at different hematocrits, namely 0, 15 and 30%, for the 100 and 1,000 nm NMPs (Supplementary Figs. S2–3). As expected, in the absence of RBCs (0% hematocrit), the NMPs follow a straight trajectory along the streamlines with no lateral drift. Differently, at 15 and 30% hematocrit, a lateral motion is also observed with a trajectory deviating away from and towards the midline. The largest and more rapid fluctuations in lateral dispersion are observed for the smaller NMPs (100 nm), at 15% HCT. Indeed, at lower HCT, the separation distance between adjacent RBCs is larger and NMPs can more easily pass through the circulating cells, thus leading to a more hectic NMP dynamics. Overall, these data demonstrate that larger, submicron to micron-sized NMPs can be more efficiently excluded by the vessel core, pushed laterally by the fast moving RBCs; whereas the smallest NMPs would tend to be confined within the vessel core and circulate for a longer time.

An effective radial dispersion coefficient can be introduced, as defined in the Methods, to account for the radial drift of the NMPs in the presence of RBCs. The actual radial dispersion coefficient D_r of a NMP divided by the corresponding Brownian diffusion D_B is plotted in Fig. 6. The radial dispersion coefficient D_r is calculated by equation (7) in the Methods. The NMP Brownian diffusion is given by the Stokes- Einstein relation as $D_B = k_B T / 3\pi\mu d$, where k_B is the Boltzmann constant, T is the absolute temperature, μ is the plasma viscosity, and d is the NMP diameter. Two different particle sizes are considered, namely 100 and 1,000 nm, at 15 and 30% HCT. The dispersion ratio D_r/D_B is higher for NMPs in the vessel core and reduces for NMPs in the cell free layer. For the 1,000 nm, the dispersion ratio is always larger than for the 100 nm NMPs, confirming that the contribution of the RBCs to the dispersion of small NMPs can be neglected. Also the average dispersion coefficient is significantly larger for the 15% than for 30% HCT, but the standard error is also much larger in the first case. At 15% hematocrit, this has to be related to the larger separation distance among adjacent cells. At 30% hematocrit, the dispersion ratio within the vessel core is about 3 times higher than the Brownian value for the 1,000 nm and it is lower than 1 for the 100 nm. This indicates again that the larger NMPs tend to be more vigorously pushed laterally by the moving RBCs and, thus, have higher chances of identifying vascular abnormalities.

Discussion

The present analysis shows that sub-micron NMPs (500–1,000 nm) only are efficiently pushed laterally by the fast moving RBCs towards

Figure 5 | Analysis of the size-dependent vascular behavior of NMPs. (a) Initially, some NMPs are distributed within the cell free layer (boundary NMPs) and other fall within the core of the capillary. Representative trajectories of NMPs with different diameters, namely (b) 10 nm; (c) 50 nm; (d) 100 nm; (e) 500 nm; and (f) 1,000 nm. The red dashed lines identify the cell free layer. The hematocrit is 30% and the number of NMPs is 100.

the vessel walls, so that they can efficiently seek for vascular abnormalities. This is clearly reflected in the intravital microscopy data of Fig. 1, in the computational analysis of Fig. 4, and by the radial dispersion coefficient data of Fig. 6. Conversely, small NMPs (≤ 100 nm) tend to circulate along with RBCs and interact with the vessel walls only in a small fraction. Incidentally, this less frequent interaction with the vessel walls and the lower surface of adhesion presented by small NMPs could explain the only minimal enhancement in tumor accumulation often observed for biologically targeted NMPs^{15,33}.

Based on the above reasoning and the presented data, sub-micron NMPs should be preferred for vascular targeting in that they would interact more efficiently with the vessel walls seeking for fenestrations and disease-specific vascular markers. On the other hand, NMPs of a few tens of nanometers, and smaller, should be used for the direct, passive targeting of diseased tissues accessible via hyper-permeable blood vessels^{34,35}. Indeed, small NMPs would penetrate deep into the malignant mass overcoming the intricate tumor extracellular matrix and the adverse interstitial fluid pressure^{19,20}, but would also carry a limited payload and are known to be rapidly cleared from the circulation³⁶. Indeed, small NMPs would cross unspecifically the discontinuous endothelium of major organs in the reticulo endothelial systems (RES), such as the liver, spleen, and bone marrow.

In summary, one could envision the optimal delivery system for vascular targeting as a nanoconstruct characterized by a sub-micrometer size, to maximize the near-wall accumulation within the cell free layer, while still avoiding entrapment in the lungs and in small capillaries⁵; a spheroidal shape, to enhance the ligand-receptor specific interaction with the vessel walls³⁷ and the lateral drift within the cell free layer towards the vessel walls⁸; and surface properties supporting specific vascular adhesion and reduced macrophage uptake.

Figure 6 | Radial dispersion coefficient D_r of the NMPs. The radial dispersion coefficient is presented for the 100 nm and 1,000 nm NMPs at two different hematocrit values, namely (a) 15% and (b) 30%. Data are presented as absolute dispersion coefficient divided by the corresponding Brownian diffusion coefficient.

Methods

In vivo intravital microscopy imaging. 8-week-old male Balb/c mice (Jackson Laboratory) were used for the in vivo experiments. After anesthesia with intraperitoneal injection of ketamine-xylazine (90 mg/kg and 9 mg/kg respectively), 70 kDa rhodamine dextran (3% w/v, 100 μ l in saline) was injected for a clear blood vessel demarcation. Then 200 nm and 1,000 nm spherical beads were injected (50 μ l), retro-orbitally, and their dynamics was studied within the microcirculation of the mouse ear. The ear of the mouse was glued on the metal plate and then placed on the stage of the microscope. For imaging, a home-built two-photon microscope with a tunable Ti:Sapphire laser (Mai-Tai DeepSee, Spectra-Physics) was used. The system employed water immersion objective lens (20X, 1.0 NA). The excitation wavelength was set to 810 nm and power was tuned to $\sim$ 25 mW at the sample. For detection, emissions at 405 ± 10 nm for second harmonic signal from the collagen, 525 ± 25 nm for the microbeads, and 600 ± 50 nm for vascular structure were collected by photomultiplier tubes. All animal experiments were performed in compliance with institutional guidelines and approved by the subcommittee on research animal care at the Massachusetts General Hospital.

Preparation of the spherical beads prior injection. For in vivo circulation studies, PEG (poly-ethylene glycol) coated polystyrene beads were used with two different sizes, 200 nm and 1,000 nm. Amine-modified polystyrene beads were purchased from FluoroSpheres, Life Technologies. For surface pegylation, the amine-modified beads were mixed with 20 kDa mPEG-succinimidyl valerate (Laysan Bio) in sodium bicarbonate buffer (pH 8.4) for 3 hours and then buffer was exchanged to phosphate buffered saline before injection.

The computational model. The Immersed Finite Element Method (IFEM)^{30–32} is a computational framework here used to simulate the transport of RBCs and NMPs within a capillary flow. IFEM allows for the efficient analysis of multiple physical interactions within the flow including fluid-structure interaction (FSI) between the plasma and the deformable RBCs and NMPs; cell-cell and cell-NMP adhesive/repulsive interactions arising at the interface between adjacent RBCs and NMPs; Brownian diffusion; pH dependent behavior; spontaneous self-assembly of molecules and so on^{30–32,38}. In this computational framework, the cells and NMPs are treated as Lagrangian solids immersed in an Eulerian fluid domain and the whole transport problem is based on the solution of a Navier-Stokes equation without requiring re-meshing as follows:

$$\rho_f \left(\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} \right) - \nabla \cdot \boldsymbol{\sigma}^f = \mathbf{f}^{\text{FSI}} + \mathbf{f}_{\text{ext}}^f \quad \text{in } \Omega \quad (1)$$

$$\nabla \cdot \mathbf{u} = 0 \quad \text{in } \Omega \quad (2)$$

$$\mathbf{f}^{\text{FSI}} = \begin{cases} (\rho_f - \rho_s) \left(\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} \right) + \nabla \cdot \boldsymbol{\sigma}^s - \nabla \cdot \boldsymbol{\sigma}^f + \mathbf{f}_{\text{ext}}^s - \mathbf{f}_{\text{ext}}^f & \text{in } \Omega_s \\ 0 & \text{in } \Omega_f \end{cases} \quad (3)$$

where ρ_f is the fluid density, ρ_s is the solid density, $\mathbf{u}$ is the fluid velocity, $\boldsymbol{\sigma}^f$ is the fluid stress, $\boldsymbol{\sigma}^s$ is the solid stress, $\mathbf{f}^{\text{FSI}}$ is the FSI interaction force for IFEM, $\mathbf{f}_{\text{ext}}^f$ is the external force on fluid, $\mathbf{f}_{\text{ext}}^s$ is the external force on solid, Ω is the entire domain including fluid and solid domains, Ω_s is the solid domain and Ω_f is the fluid domain. The fluid in the microvessel is considered as an incompressible viscous liquid with density 1.0 g/cm³, viscosity 1.2×10^{-3} Pa·s. For a detailed description of the computational model, readers are referred to previous work^{30–32,39}. Briefly, the FSI forces, represented by the term $\mathbf{f}^{\text{FSI}}$ in equations (1) and (3) are calculated only on the area of the immersed solid element (individual cell and NMP) then, applied onto the surrounding fluid domain using a direct forcing technique³². The fluid domain, here representing the blood plasma, is directly simulated using a standard fluid solver.

Interactions between immersed solids within the flow field. A Morse type potential³¹ is incorporated in IFEM scheme for describing the RBC-RBC interaction as

$$\Phi_M(r) = D_e \left\{ e^{2\beta(r_0^M - r)} - 2e^{\beta(r_0^M - r)} \right\} \quad (4)$$

where Φ_M is the Morse potential, D_e and r_0^M are the surface energy and zero force length, β is the scaling factor. Also, to avoid overlapping between solid bodies, a Lennard-Jones potential is used to account for the NMP-NMP and RBC-NMP interactions as follow

$$\Phi_{LJ}(r) = 4\epsilon \left\{ \left(\frac{r_0^{LJ}}{r} \right)^{12} - \left(\frac{r_0^{LJ}}{r} \right)^6 \right\} \quad (5)$$

where Φ_{LJ} is the Lennard-Jones potential, ϵ is the scaling parameter, and r_0^{LJ} is the distance for zero interaction energy. The Morse and Lennard-Jones potentials are converted as an external force term ($\mathbf{f}_{\text{ext}}^s$) and included in equation (3). The values for the parameters used in the present computation are listed in Table 1 and Supplementary Table S1.

RBC constitutive relation. The deformation of RBCs is described by Mooney-Rivlin material description³¹ as

$$W = C_1(I_1 - 3) + C_2(I_2 - 3) \quad (6)$$

where W is the elastic energy potential, C_1 and C_2 are the material constants, and I_1 and I_2 are functions of the invariants of the Cauchy-Green deformation tensor. $\boldsymbol{\sigma}^f$ in equation (3) is calculated by Reproducing Kernel Particle Method³⁹ and incorporated in a part of the $\mathbf{f}^{\text{FSI}}$ force in equation (1).

Coefficient of radial dispersion (D_r). For quantifying the radial dispersion of NMPs with a number of particles N , the dispersion coefficient (D_r) is described as²⁷

$$D_r = \frac{1}{N} \sum_{i=1}^N \frac{(r_i(t) - r_i(0))^2}{2t} \quad (7)$$

where $r_i(t)$ and $r_i(0)$ is the distance of the NMPs from the center of the channel at the time t and the initial distance, respectively.

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Author contributions

T.-R.L. performed all the numerical experiments; M.C. performed all the intravital microscopy experiments; A.M.K. helped in performing the numerical experiments; S.-H.Y. and W.K.L. provided input on the experimental plan; P.D. conceived the idea, designed the experimental plan, and wrote the manuscript. All the authors helped in writing the manuscript, discussed the results and commented on the manuscript.

Additional information

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