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## Quantitative nanoparticle tracking: applications to nanomedicine

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### Abstract

Particle tracking is an invaluable technique to extract quantitative and qualitative information regarding the transport of nanomaterials through complex biological environments. This technique can be used to probe the dynamic behavior of nanoparticles as they interact with and navigate through intra- and extra-cellular barriers. In this article, we focus on the recent developments in the application of particle-tracking technology to nanomedicine, including the study of synthetic and virus-based materials designed for gene and drug delivery. Specifically, we cover research where mean square displacements of nanomaterial transport were explicitly determined in order to quantitatively assess the transport of nanoparticles through biological environments. Particle-tracking experiments can provide important insights that may help guide the design of more intelligent and effective diagnostic and therapeutic nanoparticles.

### Keywords

extracellular; intracellular; nanoparticle; particle tracking; virus

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The ability to navigate intra- and extra-cellular barriers successfully is critical if nanoparticles (NPs) are to achieve diagnostic and/or therapeutic goals. This is no trivial task. The complex biological environments NPs must travel through are full of steric and adhesive obstacles that can severely limit effective targeting and delivery. NPs do not always behave as expected, owing to nanoscopic interactions that are not detected at the macroscopic level. Investigative tools to probe the behavior of NPs at the length scale of the particles may unveil important information that can be used to improve the design of engineered nanomaterials.

Quantitative particle tracking is one such technique. With particle tracking, transport properties of individual particles (or aggregates of particles depending on the colloidal status) can be extracted with high resolution. Quantitative parameters, such as diffusivity and velocity, and qualitative parameters, such as mode and directionality of transport, can be obtained for each NP. From such information, much insight can be attained regarding the

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biophysics characterizing the transport of nanomaterials through the complex intra- and extra-cellular environments. The dynamics of NP transport and their interaction with cellular or tissue components can be quantified in a simple, direct manner.

The experiment workflow for particle tracking is shown in Figure 1. Some nanomaterials, such as single-walled carbon nanotubes (SWNTs), exhibit intrinsic fluorescence that can be used for imaging. NPs lacking intrinsic fluorescence are first labeled and then added to either cells or extracellular models. A fluorescence/confocal microscope is used to capture high-resolution movies documenting the transport of NPs through the respective biological environments. Using commercially available, free or custom software, the movies are analyzed to extract  $x$  and  $y$  positional data over time. The obtained trajectories can be visually inspected for qualitative information regarding NP transport, and the positional data is used to calculate mean square displacement (MSD). In most cases, the optical slice of an image is much smaller than its  $x$ - $y$  dimensions; therefore, the tracked particle movement can be simplified as 2D. MSD in two dimensions of a given trajectory of  $x,y$  coordinates is defined as [1]:

$$MSD(t)=MSD(n\Delta t)=\frac{1}{N-n}\sum_i^{N-n}[(x_{i+n}-x_i)^2+(y_{i+n}-y_i)^2]$$

where  $x_i$  and  $y_i$  are the positions for each time point indicated by  $i$ ,  $N$  is the total number of frames (or points of a trajectory),  $\Delta t$  is time between frames, and  $n$  is number of time intervals. Based on MSD versus  $t$  relationships, particle motion can be classified into four transport modes [2–4]:

- Normal diffusion (diffusion mode):

$$MSD=4Dt$$

- Anomalous diffusion (hindered mode):

$$MSD=4Dt^\alpha$$

- Directed motion with diffusion (active transport mode):

$$MSD=4Dt+v^2 t^2$$

- Corralled diffusion (confined diffusion mode):

$$MSD \cong C[1 - A_1 \exp(-4A_2Dt/C)]$$

where  $D$  is the microscopic diffusion coefficient ( $\alpha < 1$ ),  $v$  is the velocity,  $C$  is the corral size, and  $A_1$  and  $A_2$  are constants determined by the corral geometry. Readers are directed to reviews elsewhere for a more in-depth description of particle-tracking technology [3–7].

In this article, we present contemporary research that applies particle-tracking technology to the study of synthetic and virus-based materials specifically designed for nanomedicine (Tables 1 & 2). We focus on primary reports that have quantified NP transport through the determination of MSD – the basic requirement for particle-tracking technology. The studies presented in this article help the nanomedicine community understand the behavior and

transport mechanisms of engineered NPs, and provide a quantitative means for investigating the effects of NP physicochemical properties on transport through biological environments. Such insights can profoundly impact the way nanomaterials are designed for biomedical applications.

## Intracellular transport of synthetic NPs

Investigation of NP intracellular transport encompasses identifying endocytic pathways, quantifying transport rates and recognizing transport modes. This information can be used to pinpoint rate-limiting steps to intracellular NP delivery, which in turn will highlight ways to improve delivery efficiency. Towards this goal, the intracellular transport of a number of nanomaterials, including polyethylenimine (PEI), polystyrene (PS), carbon nanotubes, lipid/quantum dot polyplexes, magnetic NPs and nanodiamonds has been investigated with particle tracking.

Particle tracking has revealed important quantitative information regarding the cellular bottlenecks to gene delivery with synthetic vectors. The first nanomaterial to be studied with particle tracking was PEI, a cationic polymer used for its ability to condense negatively charged DNA [8] and mediate gene delivery [9–12]. In the study by Suh *et al.*, the subcellular transport of PEI NPs was studied in live cells. The average size of the PEI NPs in this study was 156 nm [13,14]. Using real-time particle tracking, PEI/DNA nanocomplexes were shown to efficiently transport to the perinuclear region in a microtubule-dependent manner, suggesting that cytoplasmic transport of these NPs is not rate limiting. Therefore, efforts to improve cytoplasmic transport are not necessary for PEI/DNA complexes. Bausinger *et al.* investigated the transport of PEI NPs from surface binding to cell division [15]. They concluded that PEI/DNA complexes are engulfed by the cell membrane, and molecular motors then facilitate the active transport of PEI NP-containing vesicles along microtubules. During mitosis, polyplexes are associated with movement along microtubules of the spindle apparatus with a speed corresponding to motor proteins. de Bruin showed that targeting PEI NPs via attachment of EGF ligands speeds up their internalization compared with unmodified controls [16]. The uptake of NPs was classified into three phases, and phase 1 – involving particle internalization – was shortened, based on the fraction of particles that were able to move into the cell before all outside particles were quenched. Thus, conjugation of bioactive ligands may improve the rate of endocytosis in addition to benefits regarding target specificity.

Nanoparticles internalized by endocytosis can also undergo exocytosis as a mechanism by which a cell clears these exogenous materials. Particle tracking offers the capability of measuring rates of NP exocytosis in combination with endocytosis. A potential drug and gene delivery vector, SWNTs, have been investigated on this subject by Jin *et al.* [2]. SWNTs have a high aspect ratio and may potentially be able to deliver multiple genes to cells more efficiently. The average size of the SWNTs in this study was 1.6 nm in diameter. Over 10,000 trajectories of DNA-wrapped SWNTs were captured and endocytosis, intracellular trafficking and exocytosis of SWNTs were identified in NIH-3T3 cells. The authors concluded that the rates of endocytosis and exocytosis were regulated by the cell to keep the intracellular concentration of NPs below cytotoxic levels.

Not all types of NPs exhibit active transport behavior in cells; some are immobilized or slowed down in certain cellular compartments. Furthermore, endosomal escape of NPs has been observed to be a difficult barrier for intracellular delivery. Nanodiamonds with a doped-color center and with low cytotoxicity are being investigated as an alternative NP for live-cell imaging owing to their luminescent properties. Neugart *et al.* studied the dynamic behavior of 50-nm nanodiamonds in living cells [17]. When incubated with HeLa cells for 3

h, 60% of nanodiamonds interact with the cells, but only 10% are internalized. The nanodiamonds are seen distributed uniformly inside cells and are immobilized in the endosomal pathway. By attaching subcellular targeting ligands to the nanodiamonds, the intracellular distribution of the particles can potentially be altered allowing for the imaging of other subcellular structures. Other nanomaterials investigated with particle tracking include magnetic NPs [18] and quantum dots. Tetramethylrhodamine-labeled iron oxide magnetic particles complexed with Cy5-labeled DNA and cationic lipid were found to have similar internalization dynamics and intracellular behavior as PEI [16]. The endosomal release of complexes takes as long as 24 h, suggesting this barrier is rate-limiting. In Gopalakrishnan *et al.*, researchers performed particle tracking on quantum dots that were embedded in the membranes of lipid vesicles and showed that the NPs are successfully immobilized within the lipid bilayers [19].

By comparing transport rates of different NP designs with particle tracking, the validity of design improvements can be determined quantitatively. For example, once NPs escape endosomes into the cytoplasm, they may need to move around to reach target organelles, proteins or biomolecules, for example, to carry out their function. Conjugation of polyethylene glycol (PEG) to NP surfaces, or PEGylation, can prevent nonspecific adhesion to intracellular structures and endow NPs with sufficient mobility. Suh *et al.* microinjected PEGylated PS or unmodified PS into live cells, and used particle tracking to quantify and compare their transport rates [20]. Notably, the diffusivities of NPs increase by 100% upon PEGylation. Analysis of transport modes indicates that 80% of the unmodified NPs experience hindered movement in the crowded cytoplasmic microenvironment. In comparison, only 50% of PEGylated NPs are hindered. Thus, PEGylation can substantially improve the cytoplasmic transport of PS NPs.

Effect of NP size on intracellular transport can also be assessed with particle tracking. Investigating different-sized carboxylated PS (COOH-PS) NPs has revealed a nondegradative trafficking pathway for nanomaterials, resulting in accumulation around the Golgi and endoplasmic reticulum (ER). Specifically, Lai *et al.* discovered a privileged nondegradative intracellular pathway for 24-nm NPs that is clathrin and caveolae independent [21,22]. By comparison, 43-nm NPs take the classic degradative pathway. The nonacidic vesicles in this pathway display hindered, diffusive and active transport modes, as well as the pearls-on-a-string motion on micro-tubules (possibly motor protein facilitated). The difference in dynamics is characterized by a lower amount of budding and fusion events for vesicles carrying 24-nm NPs than those carrying 43-nm NPs. The result of the alternative transport pathway is the accumulation of NPs around the Golgi and ER in nondegradative vesicles. This prolonged retention time of NPs near the nucleus can be advantageous when delivering therapeutic agents to this target organelle.

## Intracellular transport of viral NPs

In contrast to synthetic gene-delivery vectors, viral vectors have been developed by nature over millions of years. Virus-based gene-delivery vectors, despite some intrinsic disadvantages, including immunogenicity, are currently the most popular platforms for gene therapy. Investigating their transport through intracellular barriers using high-resolution particle tracking can be highly useful in elucidating the infectious pathway quantitatively. This provides invaluable information for the improvement of viral vectors, as well as inspiring new ways to create non-viral vectors. One of the first viruses to be studied with particle tracking is the adeno-associated virus (AAV) [23]. AAV particles were labeled with a single Cy5 dye molecule and their transport within live cells was documented. MSD calculations were used to draw conclusions about the different modes of virus transport as the viruses moved through the cell cytoplasm and into the nucleus. This study yielded the

first clues on the short-range dynamics of intracellular AAV transport. In Lakadamyali *et al.*, the authors overcame previous difficulties in labeling the influenza virus to be able to perform quantitative single-virus particle tracking and investigate the transport and fusion of viruses [24]. The results indicate that there are three stages of virus transport dependent on actin filaments and microtubules. In Babcock *et al.*, the authors studied influenza ribonucleoproteins and found that they diffuse through the cytoplasm and the nucleus [25]. Collectively, particle-tracking studies of AAV and influenza have further verified the important role of cytoskeletal elements in the effective infection process of viruses. Ability of synthetic NPs to harness these same intracellular highways may be an important design criterion.

Particle tracking is a useful technique to compare the quantitative transport of viruses and synthetic NPs side-by-side. Adenovirus is a popular viral gene-delivery vector exploited for its ability to efficiently deliver relatively large amounts of DNA to both dividing and nondividing cells. In Suk *et al.*, the intracellular transport of adenoviruses was compared with that of nonviral PEI NPs using particle tracking [26]. Results indicate that adenoviruses escape endosomes more efficiently than PEI NPs, potentially explaining why these viral vectors are more effective at delivering genes compared with the nonviral vectors. In Akita *et al.*, the authors compared the cytoplasmic transport of octaarginine-modified liposome (R8-lip) to that of adenovirus [27]. R8-lipo was directionally transported within vesicular compartments at a rate slower than that of adenoviruses that underwent fast directional transport on micro-tubules. By comparing the transport properties of efficient virus vectors to less efficient nonviral vectors, clues to how nonviral vector designs can be improved may be unveiled.

## Extracellular transport of NPs

The effective transport of NPs through extracellular barriers, such as mucus and interstitium, may be critically important in order to achieve the desired therapeutic and/or diagnostic goals. Particle tracking can be an invaluable tool to probe the quantitative transport properties of engineered nanomaterials as they move through these complex barriers. Information gathered from particle-tracking experiments can feedback into the design process to improve NP physicochemical properties and reach design aims.

Mucus is composed of mucin fibers in a low viscosity interstitial fluid, and protects the body against toxic particles and pathogens by steric exclusion and adhesive trapping. Pathogens immobilized in mucus are then cleared rapidly. These same functions, however, also make mucus a potentially critical barrier to the transport of NPs if the target cells are underneath the mucus layer. NPs need to evade mucoadhesive trapping, navigate the lower viscosity pores of the gel and transport through to the other side rapidly before clearance can occur.

The transport behavior of NPs through mucus may be difficult to predict at the nanoscale. This is where particle-tracking technology can prove to be invaluable. In Lai *et al.*, the authors tracked the transport of COOH-PS NPs of various physicochemical properties in mucus to determine which properties allowed the NPs to diffuse fastest through mucus. Surprisingly, they found that 200–500-nm particles are able to move faster in mucus than 100-nm particles [28]. This study exemplifies this nonintuitive behavior, so particles must be studied carefully using quantitative tools, such as particle tracking. In cystic fibrosis (CF) sputum, 100-, 200- and 500-nm COOH-PS NPs have large variant transport rates, with smaller NPs having few but fast-moving populations [29]. Furthermore, COOH-PS NPs may be more adhesive to CF sputum than amine-modified particles.

To improve the mucus transport of NPs, the effect of an antiadhesive coating provided by PEGylation was investigated with particle tracking. In Wang *et al.*, the authors looked at

different levels of PEGylation of COOH-PS NPs and their ability to speed-up travel through mucus [30]. Results indicate high coverage provided by the smaller 2-kDa molecular weight PEG is best for this purpose and produces a 1000-fold increase in MSD. In Cu *et al.*, a diffusion model based on Fickian mass transport was used to solve the effective diffusion coefficients of various PEGylated and unmodified NPs in cervical mucus [31]. NPs of 170 nm and coated with PEG to neutralize surface charge move unhindered in the mucosal gel, suggesting PEGylated vectors can deliver greater drug doses to the underlying epithelium. PEGylation of a NP made from a different material, polysebacic acid, increases MSD two- to ten-fold through mucus [32].

Using a different material itself can impact transport rates as sub-200-nm poly (D,L-lactico-glycolic) acid NP can travel through mucus ten-times faster than similarly sized PS NPs [33]. The authors suggest that differences in particle surface hydrophilicity and aggregate-mucus interaction may have been responsible for the difference in transport between the two particles. Lai *et al.* went on to develop different-sized nonadhesive PEGylated COOH-PS NPs, and quantified their transport through cervicovaginal mucus using particle tracking [34]. Results indicate mucus becomes highly permeable to NPs smaller than 500 nm, which makes small non-adhesive delivery systems ideal for mucosal delivery. In fact, the engineered NPs display greater transport rates than herpes simplex viruses that are even slightly smaller in size [35]. Remarkably, effective diffusivities of the NPs in cervicovaginal mucus are just slightly lower than in water. In Suk *et al.*, the authors were interested in developing a delivery vector that would be able to penetrate CF mucus [36]. They discovered that PEGylated COOH-PS NPs up to 200 nm were able to travel through this mucus without sticking.

Delivering NPs to the tumor interstitium is an important goal for many NP-based technologies. Studying this process in a quantitative fashion will unveil ways to improve NP design. Notably, Kawai *et al.* quantitatively characterized the transport of model drug delivery vectors *in vivo* through tumor vessels and the interstitium after intravascular injection [1]. This study uncovered the behavior of different-sized NPs within different interstitial spaces. NP trajectories were constructed from confocal images taken at the perivascular, interstitia and intercellular areas of the xenograft tumor. Experiments show MSD, velocity and diffusion coefficients of the NPs are inversely related to their size. The findings provide guidelines for designing therapeutic NPs that can effectively transport through interstitium to reach tumor cells.

## Future perspective

Quantitative particle tracking has proven to be invaluable for studying the transport of biomedical nanomaterials within live cells and through extracellular environments. A number of quantitative and qualitative transport parameters can be determined to provide a comprehensive picture of NP transport. Continued investigation of NP transport in a quantitative fashion should reveal more ways to improve the design of current vectors. Correlations between NP physiochemical properties and transport behavior obtained with particle-tracking experiments can be powerful design paradigms for creating the next generation of sophisticated materials for nanomedicine. For example, by choosing the right combination of NP size and surface properties, transport through extracellular environments can be controlled. All of the examples presented in this article are focused on developing NPs with faster transport through the extracellular space. Future work in this area may involve generation of NPs with more sophisticated transport behaviors, such as those that can switch between different modes of transport depending on the local conditions. Furthermore, by quantitatively characterizing how viruses transport within live cells, ideas of how to improve the efficiency of nonviral vectors can be obtained. Using nature as

inspiration may yield the next generation of biomimetic artificial viruses that can effectively and intelligently transport to target subcellular sites and mediate desired diagnostic and/or therapeutic functions.

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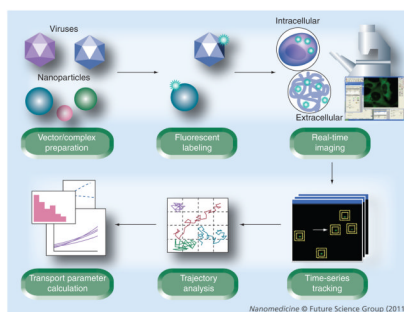
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#### Executive summary

- Particle tracking is a useful technique to investigate nanoparticle transport, both quantitatively and qualitatively.
- Nanoparticle transport through intra- and extra-cellular barriers can be studied with particle tracking.
- Experimental workflow for particle tracking involves labeling nanoparticles, capturing movies with a fluorescence/confocal microscope, analyzing the movies and calculating transport parameters, such as diffusivity and velocity.
- Intra- and extra-cellular transport of a variety of synthetic nanoparticles has been studied with particle tracking.
- Physicochemical properties affect intra- and extra-cellular transport behavior of nanoparticles.
- Transport of a handful of viruses has been studied with particle tracking.
- Further correlations between nanoparticle properties and biological transport behavior can serve as design paradigms for creating the next generation of sophisticated nanomaterials with novel functions.



**Figure 1. Workflow for particle-tracking experiments**

Nanomaterials lacking intrinsic fluorescence are labeled with fluorophores. After adding nanoparticles to live cells or extracellular models, a confocal or epifluorescence microscope equipped with a charge-coupled device camera or photomultiplier tube is used to capture time series images at the desired temporal resolution. The movies are processed with commercial, free or custom software to generate  $x,y$  coordinate datasets to reconstruct trajectories of particles. Data are analyzed to calculate transport parameters, such as mean square displacement, diffusion coefficient and velocity.

Table 1

Intracellular nanoparticle transport studies using particle tracking.

Author (year)	Vector	Vector type	Cargo	Diameter (nm)	Label	Cell	Microscope	Tracking software	Transport parameters	Ref.
Suh <i>et al.</i> (2003)	PEI	Nonviral	Salmon DNA	156	OG514-PEI	COS-7	EF	MetaMorph	MSD, RC	[13]
Suh <i>et al.</i> (2004)	PEI	Nonviral	Salmon DNA	138	OG514-PEI	COS-7	EF	MetaMorph	MSD, D	[14]
de Bruin <i>et al.</i> (2007)	LPEI, EGF-PEG-PEI	Nonviral	pDNA	85–266	Cy5-DNA Cy3-DNA	HuH7	WFF	MATLAB	MSD, D, v	[16]
Bausinger <i>et al.</i> (2006)	PEI	Nonviral	pCMVLuc	85, 165	Cy3-DNA	HuH7	Confocal	Unspecified	MSD, D, v	[15]
Suh <i>et al.</i> (2007)	PEG-COOH-PS	Nonviral	None	100	Proprietary dye	HeLa	EF	MetaMorph	MSD, D, RC	[20]
Lai <i>et al.</i> (2007)	COOH-PS	Nonviral	None	20, 40, 200	Proprietary dye	HeLa, PHUVEC	Confocal	MetaMorph	MSD, D	[22]
Lai <i>et al.</i> (2008)	COOH-PS	Nonviral	None	24, 43	Proprietary dye	HeLa	Confocal	MetaMorph	MSD, D, RC	[21]
Sauer <i>et al.</i> (2009)	MgNP, lipoplex	Nonviral	GFP Nuc pDNA	388	TMR-MgNP, Cy5-DNA	HuH7	WFF	MATLAB	MSD, D, v	[18]
Gopalakrishnan <i>et al.</i> (2006)	Lipid/QD	Nonviral	None	100	Intrinsic	HEK293	Confocal	Unspecified	MSD	[19]
Jin <i>et al.</i> (2008)	SWNT	Nonviral	D(GT) <sub>15</sub>	2 × 20	Intrinsic	NIH3T3	Fluorescence	ImageJ	MSD	[2]
Neugart <i>et al.</i> (2007)	Nanodiamond	Nonviral	None	50	Intrinsic	HeLa	Confocal	Unspecified	MSD, D	[17]
Lakadamyali <i>et al.</i> (2003)	Influenza X31	Viral	Unspecified	Unspecified	DiD, Cy3, Cy5Her5	CHO HeLa	DIC, EF	Unspecified	MSD, v	[24]
Babcock <i>et al.</i> (2004)	Influenza X31, vRNP	Viral	Unspecified	30–100	Cy3-vRNP	BS-C-1	DIC, EF	Unspecified	MSD, v	[25]
Suk <i>et al.</i> (2007)	Ad, PEI	Viral	Salmon DNA	143	OG488-PEI GFP-Ad	Rat primary neuron	Confocal	MetaMorph	MSD, D, RC	[26]
Akita <i>et al.</i> (2010)	R8-lip, Ad	Viral	pDNA	189	Rho-lip, TR-Ad	HeLa	WFF	G-track	MSD, D, v	[27]
Seisenberger <i>et al.</i> (2001)	AAV	Viral	Unspecified	20	Cy5-AAV	HeLa	EF	Unspecified	MSD	[23]

AAV: Adeno-associated virus; Ad: Adenovirus; APS: Amine-modified polystyrene; CD: Cyclodextrin; D: Diffusion coefficient; DIC: Differential interference contrast; DiD: 1,1'-dioctadecyl-3,3',3'-tetramethylindodicarbocyanine; EF: Epifluorescence; FCS: Fluorescence correlation spectroscopy; GFP: Green fluorescent protein; HSNF: Human skin normal fibroblast; ICS: Spatio-temporal image correlation spectroscopy; LPEI: Linear polyethylenimine; MgNP: Magnetic nanoparticle; MSD: Mean square displacement; OG: Oregon Green; PEG: Poly(ethylene glycol); PEI: Polyethylenimine; PHUVEC: Primary human umbilical vein endothelial cells; PS: Polystyrene; QD: Quantum dot; R8-lip: Octa-arginine-modified liposome; RC: Relative change; Rho: Rhodamine; SWNT: Single-wall nanotube; TMR: Tetramethylrhodamine; TR: Texas Red; v: Velocity; vRNP: Ribonucleoprotein; WFF: Wide-field fluorescence.

Table 2

Extracellular nanoparticle transport studies using particle tracking.

Author (year)	Vector	Diameter (nm)	Label	ECM	Microscope	Tracking software	Transport parameters	Ref.
Lai <i>et al.</i> (2007)	PEG-COOH-PS	100–500	Proprietary dye	CVM	EF	MetaMorph	MSD, <i>D</i>	[28]
Wang <i>et al.</i> (2008)	PEG-COOH-PS	200	AF 647-PS	CVM	EF	MetaMorph	MSD, <i>D</i>	[30]
Tang <i>et al.</i> (2009)	PSA, PSA-PEG, PLGA	100–200	Dox/PSA, PLGA	CVM, CFS	EF	MetaMorph, MATLAB	MSD	[32]
Lai <i>et al.</i> (2009)	PEG-COOH-PS	100, 200, 500, 1000	Proprietary dye	CVM	EF	MetaMorph	MSD	[34]
Lai <i>et al.</i> (2010)	PEG-COOH-PS, HSV-1	100–1000, 180	Proprietary dye-PS AF488-HSV GFP-HSV	CVM	EF	MetaMorph	MSD, <i>D</i>	[35]
Dawson <i>et al.</i> (2003)	COOH-PS APS	100–500	Proprietary dye	CFS	EF, confocal	MetaMorph	MSD, <i>D</i>	[29]
Sak <i>et al.</i> (2009)	COOH-PS	100, 200, 500	Proprietary dye	CFS	EF	MetaMorph	MSD, <i>D</i>	[36]
Dawson <i>et al.</i> (2004)	PLGA-DDAB COOH-PS	<200	Proprietary dye	PGM	Confocal	MetaMorph	MSD, <i>D</i>	[33]
Cu and Saltzman (2009)	PEG-PLGA	170	Coumarin 6	CM	Fluorescence	ImageJ	<i>D</i>	[31]
Kawai <i>et al.</i> (2009)	QD705, fluosphere	20, 40, 100	Intrinsic	Interstitialium	EF	Unspecified	MSD, <i>D</i> , <i>v</i>	[1]

APS: Amine-modified polystyrene; CFS: Cystic fibrosis sputum; CM: Cervical mucus; CVM: Cervicovaginal mucus; D: Diffusion coefficient; Dox: Doxorubicin; ECM: Extracellular matrix; EF: Epifluorescence; GFP: Green fluorescent protein; HSV: Herpes simplex virus; MSD: Mean square displacement; PEG: Poly(ethylene glycol); PGM: Pig gastric mucus; PLGA: Poly(D,L-lactic-co-glycolic acid); PS: Polystyrene; PSA: Poly(sebacic acid); QD: Quantum dot; *v*: Velocity.