Bioimaging guided pharmaceutical evaluations of nanomedicines for clinical translations

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Abstract
Nanomedicines (NMs) have emerged as an efficient approach for developing novel treatment strategies against a variety of diseases. Over the past few decades, NM formulations have received great attention, and a large number of studies have been performed in this field. Despite this, only about 60 nano-formulations have received industrial acceptance and are currently available for clinical use. Their in vivo pharmaceutical behavior is considered one of the main challenges and hurdles for the effective clinical translation of NMs, because it is difficult to monitor the pharmacodynamic and pharmacokinetic behavior of labeled NMs in the biological environment using conventional pharmaceutical evaluations. In this context, non-invasive imaging modalities offer attractive solutions, providing the direct monitoring and quantification of the pharmacokinetic and pharmacodynamic behavior of labeled NMs in a real-time manner. Imaging evaluations have great potential for revealing the relationship between the physicochemical properties of NMs and their pharmaceutical profiles in living subjects. In this review, we introduced imaging techniques that can be used for in vivo NM evaluations. We also provided an overview of various studies on the influence of key parameters on the in vivo pharmaceutical behavior of NMs that had been visualized in a non-invasive and real-time manner.

Keywords: Nanomedicine, Biomedical imaging, Pharmaceutical evaluations, Physicochemical characteristics
Introduction
In alignment with rapid advances in biomedical and pharmaceutical sciences in the last few decades, the unprecedented development of nanotechnological approaches has greatly promoted the emergence of nanomedicines (NMs) exhibiting high diagnostic/therapeutic efficacy and improved safety profiles [1]. NMs are intended to maximize therapeutic/diagnostic efficacy while avoiding off-target and accumulation-related adverse effects by delivering therapeutic or imaging agents (passively or actively) to the tissue of interest [2]. Therapeutic agents in the nanoscale size range have found wide applications in the treatment of ailments such as cancer, chronic inflammation, or vascular diseases [3–5]. Due to the small size and high surface-area-to-volume ratio, the NMs exhibit remarkable differences in chemical reactivity, fluorescence, magnetic permeability, and electrical conductivity compared with conventional bulk chemical equivalents [6]. These unique properties can greatly enhance the range of possibilities in the development of innovative drugs. However, these properties can also bring about additional challenges and limitations related to the quality, safety, and efficacy of the nanoscaled products. The physicochemical properties of the NMs can alter pharmacokinetic profiles, changing their absorption, distribution, metabolism, and elimination, which results in general concerns on the application of NMs [7]. The interaction of NMs with their biological surroundings (at molecular, cellular, and organ levels) greatly depends on the complex interplay of the controllable properties of the nanoparticles and the largely uncontrollable properties of their surroundings. Particle size, shape, and surface chemistry are key factors governing the performance criteria, including the degree of protein adsorption, cellular uptake, biodistribution patterns, and clearance mechanisms [8]. NMs have the potential to be precisely designed by tuning these factors to achieve individualized and more efficient treatment and diagnostic agents while minimizing potential side effects [9, 10]. As the NMs landscape evolves, it is increasingly important to understand the intrinsic connection between the structural and functional relationship, which allows the further optimization and manipulation of fine nanostructures to meet general standards, applicable to medicinal compounds.

Along with traditional and biological drugs, the approval process of NMs is regulated by the Food and
Drug Administration (FDA) in the USA. Therefore, NMs are usually subjected to the standard range of preclinical and clinical validation. Following the discovery of the material, the preclinical phase of testing generally involves animal studies that investigate efficacy, safety, and toxicity profiles, as well as appropriate dose ranges [11]. When dealing with NMs, it is of great importance to achieve a comprehensive understanding of their physicochemical characteristics, and significant research is still required to evaluate their behavior in biological systems, including the use of both new assays and existing methods. Despite numerous research activities in academia and clinics, there are very limited NMs approved for clinical usage, whereas more than 400 nano-engineered products are currently in ongoing clinical trials. The pharmaceutical evaluation of NMs remains a key issue in several guidance documents published by the FDA over the past few years, which is also an important aspect of research and development [12]. Thus, the translation of novel concepts like NMs into commercially viable products for clinical application requires rigorous evaluation on the basis of regulatory guidance regarding their quality, safety, and efficacy.

Due to the physicochemical complexity of NMs related to their size, shape distribution, surface chemistry, single/multiphasic composition, and presence of cognitive groups, it remains a formidable challenge to investigate their pharmaceutical profiles in a biological environment using conventional pharmaceutical evaluations. To address this challenge, various efforts have been made to perform in situ visualization of metabolic behaviors of systemically administrated NMs with newly-developed imaging modalities and technologies [13–17]. The ability to account for the total dose administered and its fate is of great importance in providing efficiency and safety. Current methods of in vivo imaging mainly include introducing chemical tags – fluorescent probes, isotope labels, and photoacoustic (PA) agents, amongst others – into NMs for tracing. Unlike conventional methods used for pharmaceutical evaluations, the non-invasive nature of biomedical imaging modalities (e.g., magnetic resonance imaging, positron emission tomography, computed tomography) allows for direct monitoring and quantification of the pharmacokinetic and pharmacodynamic behavior of labeled NMs in a real-time manner. The use of in vivo imaging methods in pharmaceutical evaluation can significantly improve the efficiency of NMs and the commercialization of innovations, taking them from laboratory concept to clinical practice (Fig. 1). In this review,
we have discussed the influence of key parameters of NMs on their in vivo behavior that had been monitored in a non-invasive and real-time manner.

**Clinical translation status of NMs**

The use of NMs has great potential to make significant impacts on human health through the prevention, diagnosis, and treatment of diseases. NMs have shown various advantages, such as crossing or penetrating biological barriers and delivering hydrophobic and biological drugs with high efficiency at the target site. The first NM approved by FDA for clinic application was named Doxil®, which exhibited prolonged drug half-life and minimized uptake by the mononuclear phagocyte system (MPS) due to the use of PEGylated liposomes [18]. Afterward, more than 60 NMs have received FDA approval for clinical applications (Fig. 2A). These marketed NMs are used for treatments of various diseases, including cancer, fungal disease, iron-replacement therapies, macular degeneration, anesthetics, and rare genetic diseases [19–21]. The majority of clinically approved classes of NMs involve nanocrystals, lipid-based, polymer-based, protein-based, and inorganic nanoparticles (NPs) (Fig. 2B). Given the large number of clinical trials of NMs in progress – over 400 NMs and increasing approved new generations of NMs will enter the market in the near future [22]. Although the ongoing clinical trials are mainly focused on cancer treatment, other clinical uses of NMs related to infectious diseases, pain treatment, vaccination, and imaging are also being tested for clinical introduction (Fig. 2C). Furthermore, new areas for treatment are emerging and encompass disorders associated with neural system diseases, eye diseases, and genetic diseases [22].

Despite the enormous amount of research reports, the commercially available NMs are still very limited. There exists a major gap between laboratory research and the clinical practice of NMs due to various challenges that arise throughout the whole stages of development. Several shortcomings have been identified as key scientific issues related to delivering NMs to patients, including the analysis and characterization of NMs, biological challenges, large-scale manufacturing, biocompatibility, and safety [23]. One of the major concerns for the translation of NMs to the clinic is the deficient understanding of NMs’ in vivo behavior. Compared with conventional pharmaceutical formulations, NMs have more complicated physicochemical features, including size distribution, morphology, surface properties, chemical composition, and stability. Thus, it is highly challenging to analyze the relationship between their physicochemical properties and their behavior in biological systems. For instance, even if NMs with similar average-sized particles have different polydispersities, it may cause...
dramatic alternations to in vivo behaviors such as biodistribution, targeting ability, drug release rate, and toxicity [24, 25]. Typically, the development of a nanoengineered product is based on a fabrication-driven approach, where a novel NM is first designed and characterized from a physicochemical perspective. Limitations in the clinical translation are revealed only when attempting to align the newly developed medicines with their biological applications. The key determinants of the successful clinical translation of NMs are their distribution, accumulation in the target tissues, retention, and efficacy as well as the correlation between NMs’ physicochemical characteristics and in vivo fate in an animal model compared to humans. From the design of NMs, it is essential to consider the physicochemical features of various NMs in overcoming biological barriers in order to ensure highly efficient targeting of the region of interest and reduced accumulation in unwanted sites [26]. Evaluations of in vivo behavior of NMs in different preclinical animal models, which represent aspects of specific diseases, are preferred for gaining a comprehensive understanding of the intrinsic structure-function correlation.

**Biomedical imaging used for in vivo pharmaceutical evaluations of NMs**

The characterization of NMs requires a combination of various techniques to understand their physicochemical features and behavior in biological systems [19, 27]. From a regulatory perspective, conventional medicines are analyzed with well-established assay systems, while NMs should follow their own framework that accounts for their complexity to establish new guidelines defining properties specific to nanomaterials. Since most of the challenges associated with the pharmaceutical evaluation of NMs arise from their structural and physicochemical complexity (e.g., size, shape, coatings, payload release) traditional approaches for drug regulation cannot be applied without a substantial adaptation to the nature of nanotechnology-related products. Pharmacological and toxicological profiling require a systematic assessment of the NMs’ behavior in different kinds of in vivo systems depending on their physicochemical properties. Therefore, the combination of physicochemical characteristics and physiological conditions determines the biological application of NMs.

To provide fundamental insights and to ensure more accurate delivery of drugs to various pathological sites, it is crucial to monitor multiple aspects of the drug delivery process quantitatively, including its biodistribution, pharmacokinetics, target site accumulation, localization in the target site, distribution to healthy organs, drug release kinetics, and therapeutic efficacy. In this context, there is growing interest in the use of non-invasive imaging modalities – e.g., magnetic resonance imaging (MRI), fluorescence imaging (FLI), positron emission tomography (PET), single photon emission computed tomography (SPECT), and computed tomography (CT) – for the real-time monitoring of NMs’ biodistribution, pharmacokinetics, drug release, and therapeutic efficacy [28]. An overview of these imaging modalities is presented in Fig. 3. The increasing use of these techniques for pharmaceutical assessment has led to the development of materials that serve as contrast agents for imaging modalities. Below, we have briefly described commonly used imaging modalities and materials serving as imaging probes that can be used for in vivo visualization and that possess a great potential for pharmaceutical evaluations.

**Magnetic resonance imaging**

Magnetic resonance imaging (MRI) is a non-invasive imaging technique that provides detailed physiological and anatomical information within living tissues. It is based on the same principle as chemical nuclear magnetic resonance (NMR), detecting the spinning and rotation of particular atomic nuclei inside the organism. Generally, the MRI signal is derived from endogenous mobile water protons, which are presented in the subject’s body. When the strong static magnetic field is applied to a subject, the magnetic moment associated with protons tends to align with the direction of the magnetic field, and the nuclei of the protons are brought out of this equilibrium by pulsed radio-frequency (RF) radiation. After the RF radiation is removed, the nuclei are returned to equilibrium and induce a transient voltage, generating the NMR signal in the receiver antenna. The alignment of the nuclei along the direction of the magnetic field does not occur instantly, but gradually over a period of time parameterized by spin–lattice relaxation time (T1). Spin–spin relaxation time (T2) is the time constant that characterizes the period of time during which nuclei remain in ‘phase’ with each other. The amount of available signal is intensely dependent on the physical characteristics of a specific region, such as nuclei density [35]. MRI is able to provide more specific details that other imaging methods are not able to access because its penetration depth is adequate to view the entire body, with a spatial resolution of up to 10 μm [36]. Despite its widespread use for the diagnosis of disease and monitoring of therapy, MRI is also commonly applied in the research of NMs to analyze biodistribution and pharmacokinetic profiles [37]. The standard MRI, however, has low sensitivity since it is often used for anatomical reasons without contrast. The low sensitivity is related to the typical signal detection mechanism of the relaxation rates of protons contained in the water and fat within tissues [38]. If one desires to enhance the detection levels and...
obtain molecular information, contrast agents (including nanomaterials) can be used in micromolar and even in nanomolar concentrations to modify the water proton relaxation rates [39, 40].

**MRI imaging probes**

MRI contrast agents are typically divided into two groups based on the physical mechanism. This process enables the MRI contrast agents to generate signal: T1 (longitudinal relaxation time) and T2 (transverse relaxation time). T1 contrast agents are typically paramagnetic species that shorten longitudinal relaxation time leading to brightening on T1-weighted MR images and represent the ‘positive’ contrasts. These contrasts emerge from the magnetically non-linear spin layers that present mainly on the surfaces of magnetic objects. At these surfaces, many unpaired electrons are retained by metal ions that help accelerate T1 relaxation [41]. One of the most commonly exploited T1 contrast agent is Gadolinium (Gd$^{3+}$). Gd$^{3+}$ - chelated complexes have been used for diagnostics for the last 30 years and have continued to be studied for improved and more functional applications. The cause behind Gd$^{3+}$ as a great T1 agent is due to its seven unpaired electrons that effectively reduce T1 values resulting in sufficiently lengthy electronic relaxation times, as a consequence generating signal that is more long-lasting [42–44]. While most of Gd$^{3+}$-based imaging agents are chelates with small molecules that may display heavy metal-associated toxic effects due to leaching processes, nanomaterials that incorporate Gd$^{3+}$ exhibit substantially less leaching, resulting in improved safety profile [45]. For instance, such nanomaterials as gadolinium phosphates (GdPO₄), gadolinium oxides (Gd₂O₃), and GdF₃:CeFn₃ have been fabricated to achieve improved in vivo behavior in MRI [46–49]. In order to avoid renal toxicity in kidney failure patients and other adverse effects of Gd$^{3+}$, other T1 contrasting materials, such as Manganese (Mn$^{2+}$) has been studied. Mn$^{2+}$- based imaging agents are considered to have ideal characteristics for MRI because of their ability to overcome toxicity issues, short circulation half-life, and low intracellular accumulation that other T1 contrast agents suffer [50]. Manganese oxide (MnO) and other materials displayed negligible toxicity and good T1 weighted contrast effects and has been used as preclinical in vivo T1 agents [51–53]. However, it was revealed that the geometry and morphology of MnO nanomaterials critically affects their relaxivity, since the interaction
with water strongly influences contrast effects [54]. The fact that T1 imaging agents generate contrast depending on approach to freely diffusing surrounding water molecules, provides suitable conditions for assessing drug release as they render distinctive signals when loaded or released from the drug delivery system [55].

T2 imaging agents are typically materials that reduce the contrast of the images under consideration, to provide ‘negative’ contrast. Majority of the magnetic nanomaterials are present by iron-based compounds that exhibit a high magnetization, which can cause magnetic inhomogeneities affecting T2 relaxation [56]. In particular, the mechanism of MR T2 contrast is based on the local magnetic field gradients that are produced by iron oxide materials for their dipoles, which are generated by spins of some of their electrons in order to interact with water protons. After the radiofrequency pulse is ceased, the dipolar connection amongst the water proton spins and the iron oxide magnetization accelerates the pace about which protons are pushed out of phase with each other, lowering T2 relaxation periods. Shorter T2 relaxation reduces signal intensity resulting in darkening and negative image contrast [57]. Iron oxide materials mainly comprise hematite (α-Fe₂O₃), magnetite (γ-Fe₂O₃), and magnetite (Fe₃O₄). All types demonstrate size-dependent properties and can be roughly divided into three groups: monocrystalline iron oxide NPs (MIONs), superparamagnetic iron oxides (SPIOs), and ultrasmall superparamagnetic iron oxides (USPIOs). These relate to varied size ranges, however the composition and structure also play a vital role. Iron oxide NPs were used in the wide variety of investigations for cancer and atherosclerosis detection, lymphoid tissue imaging, and tracking cells such as immune cells and stem cells throughout the body [58–62]. Aside from pure iron oxide, a number of iron alloys such as FeCo, CoFe₂O₄, MnFe₂O₄, NiFe₂O₄, FePt, and others, have been fabricated to enhance T2 signal and produce high contrast [63–67]. These contributed to improved visualization of very small structures, which helped in more accurate diagnose and assess diseases. Throughout history, iron oxide has been used in human beings, considered safe, and a large number of techniques have been developed to fabricate particles with varying range of sizes, structures, and combinations with other materials. Recent modification of fabrication chemistries achieved specifically concise control of standard iron oxides size, crystallinity, surface properties, and uniformity resulting in substantially improved in vivo behavior and imaging properties [29, 39, 68, 69]. Although iron oxide is extensively used for iron-based imaging agents, current achievements have greatly expanded the iron state space and all magnetic materials. These newly engineered contrast agents possess higher saturation magnetizations and magnetic moments resulting in improved preclinical magnetic imaging by enhancing image contrast and reducing the amounts obligatory for administration.

**Fluorescence imaging**

Fluorescence imaging (FLI) has become an essential tool for evaluating the biodistribution and target site accumulation of NMs due to its ease of use and excellent contrast agent sensitivity [70, 71]. FLI is based on photon-electron interactions and their resulting electron energy states. It exploits differential electron states stimulated by incoming excitation light, leading to emission of a longer-wavelength photon. Generally, the fluorescent process involves the absorption of light by tissues, followed by the emission of some of this light, which is captured with a detector that converts this information into images. The aim is to separate the emitted light from the excitation light [72]. The key to the visualization of living objects with FLI is maximizing penetration depth and minimizing background signal while maintaining signal resolution and intensity. This can be achieved by using different approaches, which includes changing the wavelength of light and enhancing intensity and contrast by multiple near-infrared (NIR) fluorophores [73, 74]. Compared with visible light, NIR fluorescence provides less tissue scattering and absorption, resulting in much higher penetration efficiency and reduced non-specific background autofluorescence interference from biological tissues [75–78]. NIR-based imaging approaches offer relatively accurate information on the localization of fluorophore-labeled NMs and allow for quantitative biodistribution assessment. The sensitivity, versatility, and ease of FLI, along with its quality of displaying several imaging probes in the same animal, are the most significant advantages of this modality. Despite the wide use of non-invasive FLI techniques in preclinical studies, some formidable hurdles still limit its popularity in clinic and industry pharmaceutic development, including its autofluorescence and insufficient penetration depth [28]. Optical agents are essential for light absorption in photo-induced imaging because, in an aggregation state, they often display redshift absorption and emission in NIR, which is advantageous for deep tissue disorders that require more light penetration.

**FLI imaging probes**

The variety of fluorescent substances used in the standard NIR window (NIR-I: 650–900 nm) has been widely utilized in both animal and clinical applications since the FDA approved the first NIR dye, indocyanine green (ICG) [79–81]. Cyanine fluorophores possess high absorption coefficients, and their chemical groups can be
modified for further improvement of optical properties [82]. Several cyanine dyes in the NIR-I region have been approved in recent years for commercial use, including DiR, Cy7.5, Cy7, IR-125, IR-140, IR-775, IR-780, IR-783, IR-797, IR-806, IR-820, IR-830, IR12-N3, IRDye800cw, HITCI, etc. However, tissue autofluorescence, quality of photon attenuation, and scattering are all relatively high when imaging at shorter wavelengths, hindering further development of NIR-I agents.

Recently, the second near-infrared (NIR-II: 900–1700 nm) fluorescence imaging method demonstrated increased imaging depths and temporal-spatial resolutions, with a greater ratio of signal and noise compared to the NIR-I window [83–88]. These significant improvements have given a new impetus to investigate novel NIR-II materials, further exploring their potential for biomedical applications including metabolism monitoring and NMs distribution in deep body tissues. Semiconducting single-walled carbon nanotubes (SWNTs), which have been employed for targeted probing of cell surface receptors and demonstrated great accuracy and specificity, were produced as one of the first NIR-II fluorescent tags with narrow band gaps [89]. After that, a wide range of optical nanomaterials that possess small effective masses and narrow band gaps, such as semiconductor quantum dots (QDs), rare-earth doped NPs, and other inorganic nanomaterials (e.g., gold NPs, mesoporous silica) had been developed [90–98]. However, inorganic nanomaterials suffer from safety issues regarding immune uptake and clearance after imaging [99]. Organic dyes, on the contrary, represent an exceptional alternative, as they offer significant biocompatibility and biosafety advantages, and their fluorescence properties can be controlled by rational chemical structure design. For example, semiconducting polymers and small molecules with an alternating electron deficient group (acceptor, A) and electron abundant group (donor, D) exhibit sharp and strong absorption and emission in the NIR-II window [100–102]. The electron acceptor with electron donor groups through π-bridging moieties. This spatial configuration of strong electron donor groups adjacent to the central electron acceptor serves to reduce the energy gap separating the hybridized levels of the highest occupied molecular orbital (HOMO)/lowest unoccupied molecular orbital (LUMO) and shifts the fluorescent emission to the NIR-II region. Reducing the band gap between the HOMO and the LUMO is an effective method to obtain D–A semiconducting molecules [103, 104]. Acceptor groups are usually presented by benzobisthiadiazole (BBTD) that has a significant quinoidal character, which allows to improve the delocalization of electrons. For the donor groups, fluorine, thiophene, and their derivatives have been developed to form the D–A–D fluorophores. To make these structures water-soluble, they are either loaded into hydrophilic polymer matrices or conjugated with polyethylene glycol (PEG) [105–109].

**Nuclear imaging**

Positron emission tomography (PET) and single-photon emission computed tomography (SPECT) are currently the most used nuclear imaging procedures. Both modalities require the administration of radioactive tracers. PET is an imaging modality in which radionuclide emits positrons that annihilate nearby electrons, thereby generating two γ photons with an energy of 511 keV that are identified by detectors embedded in PET scanners. In contrast to PET, the radiotracer used in SPECT emits γ-rays that are measured directly and the energies used in SPECT are varied, and energy-dependent imaging allows simultaneous evaluation of different radioactive tracers and therefore different radioactively labeled nanomaterials [110]. Nuclear-based visualization techniques, like those of magnetic materials, show remarkable advantages due to their ultrahigh sensitivity and unlimited penetration through the whole body and have a great potential to be used at preclinical level for monitoring biodistribution and pharmacokinetics of administered NMs. The ultrahigh sensitivity of radio isotopic nuclear imaging is a key benefit; only “trace” quantities of radioisotope are required to produce a sufficient signal level. The selection of radiolabel is influenced by the physical properties of the isotope, like positron energy (which determine its travelling distances in tissue, and thus the spatial resolution of the image formed), decaying half-life, and the effectiveness of the radionlabeling method. Theoretically, any type of NMs can be tagged with radionuclides, pinpointing the exact location of their accumulation. Three approaches—surface coupling, interior integration, and interface engineering—have been widely employed to label NMs with radionuclides [111].

**Nuclear imaging probes**

Surface coupling is based on the decoration of nanomaterials surface by radionuclides. Typically, two strategies are applied for carrying out this process, namely the indirect surface labeling and the direct surface labeling. In the first strategy, certain chelators such as diethylenetriaminepentaacetic acid (DTPA), 1,4,7,10-tetraazacyclododecane-1,4,7,10-tetraacetic acid (DOTA), 1,4,7-triazacyclononane-1,4,7-triacetic acid (NOTA), and deferoxamine (DFO) are anchored on the top layer of NMs for linking with metallic radionuclides (e.g., 99mTc, 177Lu, 64Cu, 68Ga), while prosthetic groups are used rather than covalently binding the NMs with non-metallic radionuclides (e.g., 111/114 C, 18 F, 76Br, 123I, 124I, 125I,
In the second strategy, radioisotopes are directly attached onto NMs by forming chemical bonds with nanomaterials. Pearson's hard and soft acids and bases hypothesis stated that the soft acids (e.g., Ag, Au, Pt) react quicker and make strong bonds with soft bases (e.g., I, Se, Br), while hard acids (e.g., Zr, Y, Sr, Sc) react faster and produce stronger bonds with the hard bases (e.g., O, F) [111]. While using this method for radiolabeling, it should be noted that surface labeling must be approached carefully, as it may alter surface properties of NMs and, thus, affect their pharmacokinetics.

Inner incorporation is defined as the fabrication of imaging probes consisting of radionuclides integrated inside the nanomaterials. This strategy involves the use of two general approaches of incorporation of radioisotopic labels that can be either doped in the lattice of inorganic nanomaterials such as iron oxide and gold NPs, or been encapsulated into organic nanomaterials including liposomes or polymeric nanomaterials. In the first approach, radioactive agents are mixed with nonradioactive inorganic precursors, in both forms – aqueous and non-aqueous, to create nanoprobe with radioisotopes dipped in the crystal lattice of nanomaterials [128–130]. The second approach is based on incorporating of radioisotopes either into the cavity of vesicle-like NPs, either with or without the addition of an additional ionophore and chelator to aid remote loading, or in the gallery space of core-shell nanostructures [131–133]. Specifically, radionuclides are attached onto the surface of NPs through the conventional surface binding technique followed by coating a protective layer of nanomaterials [134]. Apart from decoration of outer part with radionuclides or their loading into the inner space, they can also be embedded at the interface between nanomaterials and ligands. For example, diphosphate of PEG derivatives was simultaneously used as a chelating group for the radiotracer and as anchor group for surface PEGylation, allowing the radiotracer located between phosphate groups from neighboring PEG ligands [135].

Due to their unlimited penetration depth, whole-body capabilities, high sensitivity, quantifiable data, and the broad range of available radioisotopic labels, nuclear imaging modalities are highly suitable for the real-time monitoring of biodistribution profiles, pharmacokinetics, and desired site accumulation of the NMs in living subjects. Importantly, the high sensitivity of PET/SPECT imaging techniques enables visualization with sub-therapeutic doses of NMs in the microdose range. There are disadvantages associated with nuclear imaging approaches, however, including low spatial resolution, the lack of anatomical information, and the necessity to administer radioactive compounds. The first two can be overcome by co-scanning with anatomical imaging techniques such as CT or MRI. Multimodal imaging allows for the collecting of more detailed information on the overall levels of probe accumulation in the tissue or organ of interest due to the much clearer images of the anatomical and spatial distribution of the probe.

**Computed tomography**

Computed tomography (CT) is a non-invasive imaging modality that takes advantage of differential tissue X-ray attenuation and thickness to produce cross-sectional and three-dimensional (3D) images of desired tissues and organs. The principle of this method is based on the ability to measure the density of the tissue passed by the X-ray beam by calculating the attenuation coefficient. CT uses the penetrating power of X-rays to produce a series of 2D radiographs of the subject viewed from different angles. Then the computed reconstruction algorithm creates a stack of cross-sectional slices from obtained 2D radiographs to provide 3D images of the internal structure of the subject [136]. CT is a commonly applied modality in clinical imaging and is traditionally used for hard tissue visualization of bone due to the high disparity between the soft and hard tissues. CT can easily differentiate tissues with high electron density tissues from relatively electron-poor structures [137]. Consequently, it is commonly used for orthopedic purposes, as well as for hybrid imaging applications, providing anatomical data with high resolution to aid in the evaluation of PET/SPECT- and FLI-based protocols [138, 139]. Its soft-tissue contrast, however, is quite inaccurate. Extrinsic contrast agents are required to obtain images of internal soft structures with high-resolution.

**CT imaging probes**

Historically, iodine was used as the atom of choice for the imaging applications of CT. There are two categories of iodine-based contrast materials: the ionic and nonionic agents. Although widely used in the clinics, the ionic iodinated imaging molecules have certain inherent drawbacks, such as the tendency to interact with biological structures and their increased intrinsic osmolality, which can potentially cause renal toxicity and other physiological issues. Moreover, high-osmolality contrast media causes reduced radio-density due to osmotic dilution. As opposed to the ionic iodinated contrast agents, the nonionic counterparts have lower osmolality and display a low incidence of adverse health effects [140]. Multiple approaches have been explored in the fabrication of iodine-containing nanosized contrast agents, including liposomes, polymeric particles, micelles, nanospheres, nanosuspensions, etc. For example, iodinated small-molecule iohexol, has been widely exploited as CT contrast agent loaded into NMs for subsequent visualization and
assessment of their biodistribution, circulation time, and tumor tissue accumulation [141, 142].

Another category of CT contrast agents are represented by metals with high X-ray attenuation coefficients (e.g., gold, barium, bismuth, tantalum, and zirconium). Gold NPs are one of the most commonly used metal-based radiopaque contrast agents since gold possesses both a high atomic number and a high density, resulting in favorable X-ray attenuating properties. Compared to iodine, gold generates 2.7 times more contrast per unit weight [143]. Gold NPs are highly suitable in evaluating the relationship between physicochemical properties of NPs and their in vivo performance. The gold NPs possess some advantageous features, such as the ease of synthesis, good control over the size, ease of surface decoration with different biologically important ligands, high chemical stability, low toxicity and good biocompatibility [144]. Gold NPs can act as a standalone intravenous X-ray imaging agent to visualize their behavior in vivo, or they can be loaded into drug delivery systems to act as labeling agents for CT imaging.

**Nano-pharmaceutical evaluations under the bioimaging guidance**

An understanding of the interactions between NMs and living subjects is extremely important. Studies describing the correlation between the structural and physicochemical properties of NMs (e.g., size, shape, surface properties, and drug release profiles) and their in vivo behavior can facilitate the establishment of new guidelines in accordance with the properties specific to nanomaterials, which may lead to faster and safer clinical translation. Moreover, the outcomes of these studies can provide a foundation for designing the next generation of novel NMs. What follows is a discussion of the influence that various key NMs parameters have on their in vivo fate, which has been monitored in a non-invasive and real-time manner.

**Size-dependent pharmaceutical evaluation of NMs under the bioimaging guidance**

The complexity of determining the optimal size of NMs for a desired application necessitates additional investigations into the in vivo behavior of NMs. General nanoparticle design guidelines will emerge due to having better knowledge of the impact the size of NMs has on absorption, dispersion, permeability, and retention. Analytical models may guide the design and functionalization of NMs by providing a quantitative relationship between their size and functionality. In order to investigate the size-dependent in vivo behavior of NMs, numerous efforts have been made to develop imaging approaches with real-time monitoring.

Circulation half-life is typically evaluation carried out by administrating the NMs and measuring their concentration in plasma at specified time intervals. In contrast, the non-invasive nature of biomedical imaging techniques realizes the direct and real-time monitoring of NMs’ pharmacokinetic behavior in vivo, without requiring the collection of blood samples [145, 146]. Detailed, non-invasive monitoring of the circulation profiles of NMs in blood vessels has attracted much interest in intravitally imaging the pharmacokinetic behavior of NMs in vivo. Biodistribution is intensely dependent on the hydrodynamic size of NMs and interactions with the living subjects. NPs with a hydrodynamic size less than 10 nm will be readily excreted by the kidneys, while NPs with a diameter larger than 200 nm will activate the complement system and will be rapidly cleared from the blood stream, accumulating in the liver and spleen [147–152]. Perez-Campana et al. developed activated, commercially available aluminum oxide (Al₂O₃) NPs with different sizes using direct irradiation with protons through the ¹⁰⁰⁰(ₚ,α)¹³ N nuclear reaction (Fig. 4A), exploiting them to perform real-time visualization of their biological fate using PET [153]. NPs are distributed throughout the vasculature, accumulating in various organs through distinct mechanisms in accordance with particle size. Large particles are captured by the smallest capillaries of the lungs or in the uptake of phagocytic cells in RES organs such as the liver, spleen, and lungs. Smaller particles accumulate in different organs by crossing the tight endothelial junctions and are quickly eliminated through the glomeruli of the kidneys (Fig. 4B–G).

Tumor tissue penetration and retention are another important parameter of NMs that is investigated while performing biodistribution studies. In contrast to free drug molecules, NMs accumulate in solid tumors more easily and selectively through the enhanced permeability and retention (EPR) effect, thus offering better antitumor activity [154]. The insufficient accumulation and inadequate tumor retention of NMs are generally attributed to sub-optimal particle sizes resulting in low therapeutic effects [155]. The application of in vivo imaging methods to assess tumor permeability and retention can greatly contribute to more rational NM designs that can achieve enhanced tumor-specific accumulation and retention to pursue efficient tumor eradication with fewer adverse effects. Permeability through the leaky tumor vasculature mainly depends on the size of both NMs and the pores. As NMs increase in size, the vascular permeability reduces [156]. The tumorous vascular pore size varies depending on tumor type and growth location [157]. For instance, Cabral et al. used a confocal laser scanning microscopy (CLSM) technique with a high-speed resonance scanner to intravitally evaluate the penetration and
accumulation of the fluorescently labeled 30 and 70 nm micelles in C26 and BxPC3 tumors [158]. At 24 h post-injection (p.i.), the extravasated 30 and 70 nm micelles were detected inside the individual cells of C26 tumor tissue and their intensities were 40% of fluorescence intensity in the vasculature immediately after administration of the micelles. In BxPC3 tumors, the extravasation behavior of the 30 and 70 nm micelles was clearly different; the 30 nm micelles achieved deep tumor accumulation, while the 70 nm micelles remained close to the vasculature.

In another study, Lv et al. fabricated lipid (DSPE-PEG-2 K)-coated CuInS/ZnS quantum dots (ZCIS QDs) with 25 and 80 nm hydrodynamic sizes [159]. They found that the ZCIS QDs with a hydrodynamic size of 25 nm offer prolonged tumor retention time, greater tumor
uptake, and deeper 4T1 tumor penetration compared to ZCIS QDs with a hydrodynamic size of 80 nm (Fig. 5). Similarly, Popovoc et al. also prepared a size series of luminescent, water-soluble QDs within the 10–150 nm size range, employing them in the study of the real-time, size-dependent particle transport parameters in solid tumors [160]. A mixture of 12 nm, 60 nm, and 125 nm NPs with various emission wavelengths were simultaneously administrated into a mouse bearing a Mu89 human melanoma, followed by intravital multiphoton microscopy of several regions of the tumor. It was observed that the 12 nm NPs extravasated easily, albeit heterogeneously, diffusing from the vessels with minimal hindrance. In contrast, the 60 nm NPs did extravasate; they did not, however, leave the immediate perivascular space, remaining within 10 μm of the vessel walls. The 125 nm particles did not noticeably extravasate.

Researchers have developed different size-adjustable NMs with greater initial sizes during blood circulation for slower elimination, converting into smaller particles in the tumor area induced by internal or external stimuli for efficient extravasation from tumor vessels, better intratumoral distribution, and longer retention [162–165]. For instance, Guo and colleagues employed PA/CT dual-modal imaging to monitor intratumoral behavior of NIR laser-triggered transformable multiple nanorods (mNRs) in a real-time and non-invasive manner [161]. The fabricated mNRs consisted of small...
bundles of uniform bismuth sulfide (BiS) NRs that were bound together by human serum albumin (HSA), with Docetaxel (DTX) entrapped in the HSA corona (BiS@HSA/DTX mNRs). These NMs exhibited an initial size of 100 nm and rapidly disassembled into smaller individual NRs (BiS@HSA iNRs) with a size of 40 nm under NIR laser exposure due to the photothermal properties of BiS NRs. After systemic administration in nude mice bearing MDA-MB-231 breast cancer, the NMs not only showed effective extravasation from the blood vessels and accumulation in the tumor tissue via the favorable EPR effect, but also demonstrated better intratumoral distribution and prolonged retention by taking advantage of the diffusion superiority of smaller NPs (Fig. 6). Indeed, smaller particles penetrate more deeply into the tumor tissue; they can still suffer, however, from inadequate accumulation and retention caused by dynamic equilibrium between the infiltration and extravasation of the NMs through the leaky tumor vasculature [158, 166]. Chen et al. proposed an opposite in vivo size manipulation strategy that can also be applied to ameliorate the intra-tumor trafficking profile of systemically administered nanomedical drugs [167]. Their research group fabricated a sophisticated system of human serum albumin (HSA) NMs decorated with diazirine (DA) and co-loaded with the photo-sensitizer indocyanine green (ICG) and the activatable chemo-drug tirapazamine (TPZ). ICG/TPZ@HSA dNMs were sensitive to successive laser irradiations and exhibited the crosslink and enlargement of the particles triggered by laser exposure. The recorded fluorescence images of 4T1 tumor-bearing mice demonstrated that the large size of dNMs – caused by laser exposure – prevented their re-penetration into blood vessels, resulting in greater tumor tissue accumulation and longer-term intratumoral persistence as compared to the individual NPs (Fig. 7).

Shape-dependent pharmaceutical evaluation of NMs under the bioimaging guidance

The shape of NMs represents another essential parameter that determines their effect on biological processes associated with therapeutic delivery. Although most of the NMs currently undergoing preclinical or clinical studies have spherical shapes, the unique features of non-spherical NMs may provide new avenues for rationally designing NMs for specific applications. Recent researches have revealed that macrophage uptake is strongly influenced by the shape of NMs [168–171]. It was demonstrated that prolate ellipsoids have high attachment ability but the lowest internalization, whereas oblate ellipsoids displayed both strengthened attachment and strengthened internalization, resulting in the highest phagocytosis
Fig. 7 Size-dependent intratumoral persistence of NMs. A schematic representation of laser-induced aggregation of dNMs. B TEM image of ICG/TP2@HSA dNMs (scale bar: 50 nm). C TEM images of dNMs at different time points upon laser irradiation. D PA visualization of dNMs in 4T1 tumor-bearing mice following i.v. administration with. E PA visualization of dNMs in 4T1 tumor-bearing mice following i.v. administration without laser irradiation at different time points. Reproduced with permission from [167]. Copyright 2018, Wiley-VCH
Along with phagocytosis rates, the hydrodynamic behavior of NMs in the blood flow also affects their circulation time. It was revealed that non-spherical NPs – particularly nanorods, nanodiscs, and nano worms – exhibited deviating hydrodynamic behavior with respect to their spherical counterparts, allowing them to align with the blood flow, which led to the extension of the circulation time [173–178]. Christian et al. applied in vivo real-time imaging to track the biodistribution and organ accumulation of paclitaxel-loaded filomicelles labeled with near-infrared fluorophores (NIRFs) [179]. Filomicelles exhibited delay in the rapid clearance by the RES, remaining in blood circulation for a minimum of 24 h after intravenous injection (Fig. 8A, B). In comparison to the identical spherical micelles, filomicelles displayed greater tumor shrinkage and less apoptosis in non-tumor tissues.

The shape of NMs also influences their biodistribution profiles. The different shapes have also been revealed to impact in vivo distribution patterns, providing new strategies for targeting desired organs. Cylindrical NPs have displayed the greatest accumulation in the liver compared to their spherical, hemispherical, and discoidal counterparts [180]. In contrast, discoidal NPs accumulated more in vascular organs such as spleens and lungs. Hemispherical NPs demonstrated similar distribution

Fig. 8 Shape-dependent biodistribution of NMs. Biodistribution of filomicelles in A549 tumor xenograft mice: A upper panel: whole body bioluminescent images of luciferase-transfected A549 tumor xenograft mice (inset: photograph of tumor); lower panel NIR fluorescence image of A549 tumor xenograft mouse that shows the diffuse fluorescence of NIRF-labeled filomicelles in circulation. Transport and distribution in tumors in vivo for nanospheres versus nanorods of the same hydrodynamic diameter. B schematic illustration of nanospheres and nanorods. C Transvascular transport rates and D distribution in orthotopic E0771 mammary tumors in vivo for nanospheres versus nanorods of the same hydrodynamic diameter (33–35 nm); E NPs penetration in tumors. Co-registered in vivo luminescence and X-ray images of the tumor-bearing mice at 1 h (left panel) and 24 h (right panel) pi. of the various types of 198Au-incorporated nanostructures: F nanospheres, G nanodisks, H nanorods, and I cubic nanocages. Reproduced with permission from [179, 181, 182]. Copyright 2009, 2014, American Chemical Society; 2011, Wiley-VCH
behavior to the spherical NPs, except they exhibit high spleen accumulation but a lesser degree of accumulation in the lungs. Minor alterations in particle shape may also substantially mediate the biodistribution of NMs. For instance, NPs of similar shape but with various aspect ratios have significantly different organ biodistributions [175]. Short-rod mesoporous silica NPs (MSNs) were shown to be easily retained in the liver, while long-rod NPs accumulated in the spleen. PEGylation led to higher distribution in the lungs for both types of NPs, and more elevated accumulation was detected for the long-rod NPs. The clearance rate of MSNs was found to be predominantly influenced by particle shape, where short-rod MSNs showed a more rapid clearance rate compared with long-rod MSNs excreted by urine and feces.

In addition to systemic circulation and biodistribution, the shape of the NMs can also influence the targeting the vascular endothelium and disease sites. Non-spherical NPs exhibit distinctive tumbling and rolling motions that result in diverse margination dynamics. Elongated particles usually have a lower drag coefficient and a greater surface area than spheres [183, 184]. Thereby, certain non-spherical NPs can adhere to the endothelial walls with greater strength because of increased multivalent bonding. Moreover, non-spherical NPs were found to possess higher degrees of lateral drifting and stronger adhesion to vessel walls, providing them with a better chance to interact with the endothelium [185–187]. The geometry of NMs was revealed to modulate disease targeting and internalization processes as well. NMs of certain non-spherical shapes demonstrated increased tumor targeting and accumulation due to factors such as prolonged circulation time, higher margination, adhesion, and extravasation; they also demonstrate less retrieval of NPs from the tumor microenvironment [188–193]. For example, Chauhan et al. applied real-time in vivo imaging to demonstrate that quantum dot-based nanorods possessed more rapid intratumoral penetration relative to quantum dot-based nanospheres (Fig. 8C–E) [181]. Similar results were obtained for gold NPs, where gold nanorods accumulated more markedly in tumor tissues than gold nanospheres in an orthotopic A2780 human ovarian cancer model [178].

In addition, radioactive 198Au-loaded gold nanocages of spherical shape as well as nanodiscs were found to have distinctive tumor uptake profiles compared to nanorods and cubic nanocages (Fig. 8F–I) [182]. In vivo luminescence visualization was conducted on the mice bearing EMT6 tumors by monitoring the Cerenkov radiation with a conventional optical in vivo imaging system. The nanospheres exhibited the longest half-life circulation, the lowest elimination by the RES, and the greatest tumor accumulation compared to nanorods, nanocages, and nanodiscs. Interestingly, nanorods and nanocages were observed in the tumors’ cores, while nanospheres and nanodiscs were distributed only on the tumors’ surfaces.

**Surface-dependent pharmaceutical evaluation of NMs under the bioimaging guidance**

Surface chemistry is one of the critical parameters of the in vivo behavior of NMs and encompasses such properties as surface hydrophobicity, surface charge, and targeting ligands, amongst others. Surface features directly determine the interaction between NMs and physiological environments; hence, they substantially influence the in vivo behavior of NMs by affecting various processes like the formation of a protein corona, systemic circulation time, biodistribution, cellular uptake, and clearance from the body [194, 195]. There is a growing focus on manipulating and optimizing the surface properties of NMs in order to increase in vivo therapeutic index while reducing adverse effects. Non-invasive imaging techniques can be integrated at this stage of the NMs development pipeline since the understanding of the intrinsic connection of the relationship between surface chemistry and in vivo behavior remains one of the pressing priorities in the progress of NMs.

**Surface charge**

Extensive studies have demonstrated that high surface charge densities—either anionic or cationic—usually cause rapid blood clearance and uptake by RES, whereas neutral charges lead to prolonged half-life and decreased RES clearance [196–199]. For instance, it was shown that fabricated PEG-oligocholic acid NPs with surface charges in the range of $-26.9$ to $37.0$ mV were phagocytosed in a higher degree if the surface charge was highly positive ($>15$ mV) or negative ($<-15$ mV), while NPs with slightly negative charges ($-8.5$ mV) exhibited lower Kupffer cell uptake and accumulation in the liver [200]. In another study, chitosan-grafted polymeric NPs displayed similar surface charge-dependent in vivo performance [148]. Cationic NPs had a shorter half-life and greater liver and spleen accumulation compared to anionic NPs, whereas higher negative charge densities caused enhanced liver accumulation and less retention in the blood. In addition, positively charged NPs tend to adsorb into the anionic surface of cells and are subsequently internalized, often resulting in acute cytotoxicity such as hemolysis and platelet aggregation [201–204]. Given the unfavorable pharmacokinetics and biodistribution of charged NPs in the body, the most clinically approved NMs have neutral (or near-neutral) surface charge [12]. Campbell et al. used real-time fluorescence imaging to compare differently charged liposomes that are either approved...
with pH-responsive N-acetyl histidine modified D-α-tocopheryl polyethylene glycol succinate (NACHis-TPGS) [206]. It was demonstrated that these NMs were able to change surface charge from negative to nearly neutral or slightly positive values in response to a decrease of pH that further had a positive impact on their biodistribution in mice bearing TRAMP-C1 tumor model. In vivo real-time observations revealed that after intravenous injection the NMs could significantly accumulate within solid tumor because of their pH-triggered near neutral surfaces.

**PEGylation**

NMs with a hydrophilic surface are able to resist plasma protein adsorption and avoid uptake by macrophages and RES clearance. This can be achieved by either coating the surface with hydrophilic polymers/moieties such as PEG and its analogues (poloxamer and poloxamine series), dextran, and chitosan, or by directly formulating NMs from block copolymers consisting of both hydrophilic and hydrophobic segments [212, 213]. He et al. fabricated three types of surface-modified silica NPs (SiNPs), including OH-SiNPs, COOH-SiNPs, and PEG-SiNPs with a size of ~45 nm and loaded with a RuBPY dye with the purpose of studying biodistribution and urinary excretion by exploiting the in vivo fluorescence imaging system [214]. The study’s outcome revealed that the PEG-SiNPs displayed a substantially longer circulation half-life (t1/2=180±40 min) compared to OH-SiNPs (t1/2=80±30 min) and COOH-SiNPs (t1/2=35±10 min). Moreover, the in vivo imaging results also demonstrated that all the IV-injected types of SiNPs were partly cleared via the renal route (Fig. 11A). In another study, Xiao and colleagues applied in vivo real-time FLI and PA imaging to demonstrate that the modification of the surface of self-assembled hydrophobic NIR dye IR-797 NPs with amphiphilic polymer C18PMH-PEG5000 (PEG-IR-797) could significantly increase accumulation and retention of NPs in tumor due to prolonged circulation time and EPR effect [82]. Naked IR-797 NPs were used as a control and displayed only moderate accumulation in tumor tissue 12 h after injection. Further biodistribution analysis revealed increased fluorescence intensities of PEG-IR-797 NPs in liver and spleen, while naked IR-797 were demonstrated to be quickly eliminated through the kidney.

The impact made by the length and density of PEG chains on the intrinsic behavior of NMs has been widely investigated. Various reports suggest that higher density and longer PEG length have better chances to mask the nanocarrier charge or surface hydrophobicity [195], Daou et al. fabricated commercial ITK705-amino QDs coated with methoxy-terminated PEG of various chain lengths.
lengths (2.75–22 kDa) [215]. The effect of the particle coating on their intrinsic behavior after IV administration was monitored using non-invasive fluorescence imaging. Fluorescence from all QDs was easily observed after injection in the superficial vasculature, which was followed by the detection of QDs in the liver, spleen, bone marrow, and skin in a PEG length-dependent manner (Fig. 11B).
corroborated with a prolonged half-life of coated QDs. Thus, an increase of PEG length seems rather beneficial for reducing RES uptake, as more goes along with a neutralization of the negative charges of the QDs. In another study, protein nanocages (PNCs) were decorated with PEG of different lengths (0.75 and 5 kDa) and loaded with Ag$_2$S QDs (Ag$_2$S@PNC$_{SV40}$-PEG750 and Ag$_2$S@PNC$_{SV40}$-PEG5K) for real-time tracking of NP migration and biodistribution [216]. Real-time NIR-II fluorescence imaging first displayed migration of both Ag$_2$S@PNC$_{SV40}$-PEG750 and Ag$_2$S@PNC$_{SV40}$-PEG5K to the heart and lung immediately after IV injection, followed by distribution into the whole body via the systemic circulation. Unlike the naked Ag$_2$S@PNC$_{SV40}$, the PEGylated PNC$_{SV40}$ demonstrated significantly enhanced blood retention with detectable fluorescence signals persisting over 12 h. In contrast, Ag$_2$S@PNC$_{SV40}$-PEG5K showed negligible fluorescence detected in the RES system. Further
quantitative assessments confirmed rapid clearance of uncoated PNCs within five minutes p.i., while Ag$_2$S@PNC$_{40}$-PEG750 and Ag$_2$S@PNC$_{40}$-PEG5K displayed substantially extended blood circulation times of 283 and 476 min, respectively. Further evaluation of half-lives by ICP-MS agreed well with the various fluorescence profiles of naked and PEGylated Ag$_2$S@PNC$_{40}$ in living mice, supporting the validity of the outcomes obtained by NIR-II imaging (Fig. 11C,D). Similarly, Khargharia constructed polyacridine peptide nanocarriers with different PEG lengths (2, 5, 10, 20, or 30 kDa) and investigated their in vivo performance, particularly in terms of pharmacokinetic profiles and biodistribution [217]. The outcomes of this study revealed that an increase of PEG length leads to circulation time extension and reduction of liver accumulation. It should be noted, however, that the dogma “longer is always better” does not apply to all cases. To confirm this, Li et al. have constructed a high-emissive NIR-II luminophore based on alternative donor-acceptor-donor (D-A-D) conjugated oligomer (DTTB), binding it with PEG ligands at different chain lengths (DTTB@PEG-1 K, DTTB@PEG-3 K, and DTTB@PEG-5 K) [218]. The sharpness feature imaged in the NIR-II window for DTTB@PEG-1 K, DTTB@PEG-3 K, and DTTB@PEG-5 K was 450, 530, and 550 μm, respectively (Fig. 12C). It was observed that the vasculature of DTTB@PEG-3 K NM-injected mice was still clearly visible one hour p.i., whereas distinct signals were detected in the liver and spleen of the mice that were exposed to DTTB@PEG-1 K and DTTB@PEG-5 K NMs (Fig. 12B). This suggested prolonged half-life of DTTB@PEG-3 K NMs in comparison to DTTB@PEG-1 K and DTTB@PEG-5 K NMs. The outcomes of real-time evaluations of circulation lifetimes were further confirmed by pharmacokinetic measurements that displayed the longest elimination half-life of DTTB@PEG-3 K NMs (1.49 h) with respect to DTTB@PEG-1 K (0.54 h) and DTTB@PEG-5 K NMs (0.95 h) (Fig. 12D).

Similarly, PEG density also impacts the intrinsic behavior of NMs by having a greater effect on the coating of the surface of a nanocarrier and its accessibility to plasma proteins [219]. For example, Barratt et al. suggested that the enhancement of the PEG density of nanocarriers from 10 to 30% resulted in a remarkable decrease of their blood circulation time and significant reduction of liver accumulation [220]. DeSimone et al. carried out a comprehensive study on the influence of PEG density on protein binding, RES uptake, pharmacokinetics, and the biodistribution of nanocarriers prepared by PRINT technology [221]. Their findings indicated that, unlike NPs with lower PEG density, the counterparts with greater PEG density demonstrated lower absorption levels of albumin proteins, leading to greater blood circulation time and lower liver accumulation. Since the length and
density of PEG has a potent effect on NMs’ half-life and biodistribution, it has been reported that these properties also make a substantial impact on the targeting and accumulation of NPs in the affected areas, including tumors [222, 223]. It’s worth noting, however, that a PEG with a density that is too high may not be appropriate for lengthening circulation or increasing accumulation in desired sites. High PEG density may result in the imbalance between the hydrophilicity and hydrophobicity of NMs, leading to physicochemical instability and aggregation during circulation, leading to a rapid elimination by RES [224, 225].

**Drug release-dependent pharmaceutical evaluation of NMs under the bioimaging guidance**

Usually, the drug-release pattern is investigated by pharmacokinetic studies that measure time-dependent plasma drug concentrations by monitoring the drug molecules themselves [226, 227]. The pharmacokinetic results, however, can vary significantly from the local ones if the drug molecules are expected to be enriched or depleted at certain local sites. This is of great importance in the treatment of cancer since the local drug concentration at the tumor tissue directly impacts therapeutic efficacy. Thus, successful chemotherapy remains challenging due to unknown drug concentrations at the tumor site, which may be insufficient or excessive. The commonly used approaches to estimate the drug release and monitor the dynamics of changes in drug concentration are extremely difficult. Generally, harvested tissues must be homogenized and cells must be lysed to release the drug from specific intracellular compartments. Throughout these processes, especially in the process of cell lysis, the intact drug carriers will also be destroyed, causing great difficulties in differentiating the released drug agents from the inactive compounds remaining in the carriers during tissue collection [228–230]. In this regard, the development of non-invasive techniques to monitor the drug release and determine its concentration kinetics in localized tissues is of crucial importance.

Tracking drug concentration in real time is critical to adjusting the in vivo drug-release rate and optimal concentration for treatment. NIR fluorescence imaging techniques, including the PA method, can provide real-time
tracking of drug delivery by taking advantage of the deep tissue penetration, high contrast, and decreased background auto-fluorescence interference [231]. The monitoring of drug concentration by directly tracking drug molecules with radionuclides or fluorochromes prior to entrapment by NMs might be a promising strategy for semi-quantitatively detecting active drug release in a non-invasive manner. By linking latent fluorophores with the drug molecules through the activatable bond, real-time information regarding the drug-release procedure can be received by using non-invasive fluorescence-detection modalities. NIR fluorophores are often exploited as fluorescent probes for drug-release monitoring in biological systems since NIR photons can penetrate deeply into the skin and underlying tissues, causing minimum damage to the biological samples while possessing low background interference. For instance, Wu et al. conjugated a NIR fluorophore – dicyanomethylene-4 H-pyran derivative (DCM) – with anti-cancer camptothecin (CPT) through a disulfide linker (DCM-S-CPT) and loaded this prod- rug into polyethylene glycol-polyactic acid (PEG-PLA) NPs [30]. The drug-release profile and cancer therapeutic efficacy was analyzed via NIR fluorescence in situ and in vivo (Fig. 13).

Zhang and colleagues fabricated a real-time drug-reporting conjugate (CPT-SS-CyN), consisting of a model therapeutic drug CPT, a disulfide linker, and a NIR fluorescent cyanine-amine dye (CyN) as a diagnostic tool for quantitative CPT release analysis [232]. This disulfide bond between CPT and the NIR dye is sensitive to intracellular reducing agents (e.g., glutathione, cysteine, and thioredoxin) and can be cleaved under their treatment, followed by drug and dye release. A linear relationship between the amount of released CPT and fluorescence intensity at 760 nm was detected, which allows for the quantitative monitoring of CPT release cells and semi-quantitative analysis in live organisms in a non-invasive and real-time manner.

Another strategy to evaluate drug-release behaviors is to construct multiple stimuli-sensitive NMs. Drug release will be instantly reflected by responsive imaging signals that are functionally related to the drug’s existence (released or entrapped). External cues for triggering drug release (e.g., temperature, magnetic field, ultrasound, or light) may, however, create additional obstacles for clinical translation since the therapeutic testing and subsequent use on patients must be carried out exclusively in clinics using specialized equipment. In this regard, it would be highly applicable to provide real-time tracking of drug release in NMs in response to internal stimuli (e.g., acidic pH, redox species, or enzymes) exhibited only by the pathological tissue. Li et al. fabricated an
enzyme-activatable core-satellite fluorescence/PA dual-modal imaging ICG/DOX@gel-CuS NMs that is comprised of gelatin NPs loaded with NIR dye indocyanine green (ICG) and chem drug DOX and decorated with "satellite" CuS NPs [233]. After injection into MDA-MB-231 tumor-bearing mice, the ICG/DOX@gel-CuS accumulated in the tumor, where the overexpressed enzymes induced the degradation of the gelatin framework, followed by DOX and ICG release, which was observed with the ICG fluorescence signal at the tumor site (Fig. 14). Furthermore, Yan et al. formulated a dual-stimuli smart nanoprobes P(Cy-S-CPT) comprised of an ionizable tertiary amine-containing diblock copolymer and a dual-channel NIR fluorescence agent, Cy-S-CPT [234]. The controllable drug release was evaluated using the 3D imaging and in vivo fluorescence, and the results revealed a precise target tumor ability of P(Cy-S-CPT) as well as controllable drug-release behavior.

Recently, different NPs-based contrast probes have been developed to track drug-release kinetics applying MRI via interaction between MRI contrast species and drug molecules [235–237]. In particular, stimuli-responsive MRI nanosystems were fabricated in which MR signals were turned off by complexing or encapsulating with drugs to conceal the paramagnetic ions from the surrounding water molecules. Followed by exogenous or endogenous stimuli activation—including temperature, light, pH, and small molecules—the MR signals exhibit marked differences along with the release or exposure of paramagnetic ions. These features make MRI potentially applicable for real-time drug-release monitoring.

Conclusion and perspectives
Imaging modalities have been successfully applied in preclinical studies on the biodistribution and pharmacokinetics of NMs, exhibiting their value for this purpose. Advancements in real-time in vivo visualization can enable extensive characterization of NMs’ behavior in biological systems. By applying state-of-the-art imaging techniques, it is possible to visualize properly labeled NMs over time throughout the body, which can allow for the quantification of their kinetic parameters, facilitate the assessment of transport and physiological properties, and provide greater insights into the intrinsic interplay between structural and functional relationships. This allows for the development and accurate construction of NMs with desired physicochemical properties that maximize their intended therapeutic benefits. Incorporating imaging techniques into the pharmaceutical evaluation of NMs will undoubtedly result in additional valuable information that conventional methods, such as blood sampling, cannot provide. This concept would significantly accelerate early-stage development and advance the path to successful clinical translation. Despite the remarkable potential of imaging-based pharmaceutical evaluation of NMs, there are issues that need to be addressed during the quantification and interpretation of imaging results.

Firstly, a general limitation of the imaging-guided estimations is the stability of the bond between the imaging probe and the NMs it labels. Bond stability is crucial for the accurate assessment of distribution kinetics and parameter values, and its breakage can lead to leakage of the imaging agent from the NMs, confounding observations and leading to inaccurate results. Furthermore, the imaging tag is most often attached to the nanocarrier rather than the drug, while the localization of the drug may differ from that of the nanocarrier after release. The biodistribution of NMs at early time points following their administration is of great importance for the accurate evaluation of pharmacokinetics. Thus, imaging techniques with low temporal resolution should be avoided in such circumstances and can only be used when a semi-quantitative evaluation is required.

Secondly, since each modality has specific advantages and limitations, the appropriate choice of imaging technique is intensely associated with the physicochemical properties of NMs, labeling methods, and spatial level (organ, tissue or cellular level). The image resolution and study duration should also be considered depending on the assessment objectives. For example, MRI has limited applications in monitoring the biodistribution of NMs due to its poor sensitivity and the difficulties of providing whole-body imaging. The low sensitivity of CT imaging results in the need for high doses of contrast agents, which can lead to potential contrast-agent-related toxicities and limitations for imaging-guided pharmaceutical evaluations of NMs. Compared with MRI and CT, the nuclear imaging techniques have the best sensitivity and allow for the visible pharmaceutic evaluation of the NMs at trace-amount. However, nuclear imaging suffers from low spatial resolution, lack of anatomical information, and the necessity of using radioactive agents. The former two can be overcome by combining PET/SPECT with CT or MRI to provide more detailed information about the anatomical and spatial distribution of the NMs. The fundamental limitations of the use of FLI for preclinical evaluations lie on the poor penetration depth of excitation/emission lights, tissue autofluorescence, and diffuse scattering of fluorescence signals in the body. These disadvantages result in inability of FLI to correctly assign the probe accumulation to specific deeper-seated tissues and organs, as well as to perform an absolute quantification of probe biodistribution and accumulation.
Thirdly, a formidable challenge is controlling and keeping constant key physicochemical properties of NMs. Since the particle size distribution, shape, and surface features have an enormous influence on targeting properties, drug release rate, biodistribution, and excretion of NMs, it is of great importance to maintain the uniformity of these characteristics to perform accurate pharmaceutical assessments.

**Fig. 14** Drug release-dependent intratumoral accumulation of NMs. Schematic representation of: A ICG/DOX@Gel-CuS NMs fabrication, B mechanism of enzyme-activated DOX release followed by real-time monitoring and quantification by fluorescence/PA dual-modal imaging. C in vivo MSOT images of mice administered ICG/DOX@Gel-CuS NMs at various time points p.i. D in vivo NIR fluorescence images of mice administered NMs via both subcutaneous (dotted arrow) and intratumor (solid arrow) injection at various time points p.i. E NIR fluorescence images of mice administered ICG/DOX@Gel-CuS NMs through i.v. injection at various time points p.i. F 3D-reconstruction of transillumination fluorescence images of mice administered NMs through i.v. injection at various tilt angles. Reproduced with permission from [233]. Copyright 2018, American Chemical Society.
Finally, it is important to keep in mind that biomedical imaging modalities are mainly focused on monitoring pharmacokinetic and pharmacodynamic behavior of NMs and they have a potential to be integrated in preclinical drug delivery research to improve NMs-based treatments. However, non-invasive imaging techniques cannot provide an adequate assessment of NMs toxicity due to complex evaluation procedures that are beyond the functionality of imaging methods. At present, classical drug toxicity assays, such as histopathology examination, are used to evaluate NMs toxicological profiles.

Abbreviations
NMs: Nanomedicines; FDA: Food and Drug Administration; PA: Photoacoustic; MPS: Mononuclear phagocyte system; NPs: Nanoparticles; MRI: Magnetic resonance imaging; MIONs: Monocrystalline iron oxide NPs; USPIOs: Ultrasmall superparamagnetic iron oxides; FLI: Fluorescence imaging; NIR: Near-infrared; HOMO: Highest occupied molecular orbital; LUMO: Lowest unoccupied molecular orbital; PET: Positron emission tomography; SPECT: Single photon emission computed tomography; DTPA: Diethylenetriaminepentaacetic acid; CT: Computed tomography; NMR: Nuclear magnetic resonance; SWNT: Semiconducting single-walled carbon nanotubes; EPR: Enhanced permeability and retention; CLSM: Confocal laser scanning microscopy; MSOT: Multispectral optical tomography; QDs: Quantum dots; TEM: Transmission electron microscopy; mNPs: Multiple nanorods; BiS: Bismuth sulfide; HSA: Human serum albumin; DTX: Docetaxel; DA: Diazirine; TP2: Tiazaprazine; MSNs: Mesoporous silica nanoparticles; CHT-EC: Caudal hematopoietic tissue endothelial cells; DLAV: Dorsal longitudinal anastomotic vessel; LV: Interssegmental vessel; CV: Caudal vein; PLGA: Poly(lactic-co-glycolic acid); NAcHis-TPGS: N-acetyl histidine modified D-α-tocopheryl polyethylene glycol succinate; NIRFs: Near-infrared fluorophores; PNCs: Protein conjugates; CPT: Camptothecin; CyN: Cyanine-amine dye; ICG: Indocyanine green.

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Competing interests
The authors declare that they have no competing interests.

Declarations
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