



Kinetics and Timescales in Bio–Nano Interactions

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Abstract: Engineered nanoparticles (NPs) have the potential to revolutionize disease diagnostics and treatment. However, NP interactions with proteins in biological fluids complicate their in vivo control. These interactions often lead to the formation of protein coronas around the NP surface, shaping NP fate and behavior within biological systems. To harness the full potential of NPs in biomedical applications, it is therefore essential to gain a comprehensive understanding of their interactions with proteins. Within this context, it must be recognized that traditional equilibrium-based descriptions of NP–protein interactions, which encompass parameters like equilibrium binding affinity and corona composition, do not provide sufficient detail to predict NP behavior in vivo. This limitation arises because the open in vivo system is a nonequilibrium state characterized by constantly changing concentrations and dynamic regulation of biological processes. In light of these considerations, this review explores the kinetics and timescales of NP–protein interactions, discussing their relevance, fundamental concepts, measurement techniques, typical ranges of association and dissociation rate constants, and dynamics of protein corona formation and dissociation. The review concludes by outlining potential areas for further research and development in this field.

Keywords: nanoparticles; nanoparticle–protein interactions; protein corona; binding affinity; kinetics; surface plasmon resonance

1. Introduction

Engineered nanoparticles (NPs) offer unique capabilities for diagnosing and treating human diseases [1]. In drug delivery applications, NPs can be designed to carry therapeutic drug formulations through the bloodstream and deliver them to specific tissues and cells, thus optimizing therapeutic efficacy while minimizing off-target toxicity [2,3]. However, despite significant efforts to date, precise control over the in vivo behaviors of NPs remains a challenging task. Upon exposure to a biological fluid, NPs readily interact with proteins and other biomolecules present in the medium [4–7]. For some NP types, these interactions result in the formation of a stable, adsorbed protein corona on the NP surface, while for other NPs, only a transient corona might form. Regardless, NP–protein interactions remain crucial in determining NP fate and behavior in the complex biological environment [8–13].

There are a myriad of interdependent factors that govern NP–protein interactions and corona formation, including the identity of the interacting proteins, their affinity for the NP surface, the kinetics of binding and unbinding, and the protein conformational changes, among others. In response to this challenge, ongoing research in the field aims to elucidate the underlying mechanisms of NP–protein interactions with the ultimate goal of manipulating these interactions to achieve desired bioresponses [7,14–17].

It must be realized that a static or equilibrium-based description of NP–protein interactions, which focuses on parameters such as equilibrium binding affinity (K_D) and corona composition, is insufficient to understand NP biobehavior in vivo. This is because the open in vivo system is a nonequilibrium state, where concentrations are in constant change and biological processes are dynamically regulated [16,18,19]. To illustrate, the rate constants governing binding and unbinding between proteins and NPs, along with the concentrations involved, exert a direct influence on the rate of protein adsorption and



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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). corona formation. Simultaneously, the rate constant of complex dissociation dictates the residence time of the bound protein on the NP surface. In this way, it becomes essential to consider the timeframes of both binding and unbinding events in relation to the timescales of relevant biological processes in order to gain a comprehensive understanding of how NPs impact biological function (Figure 1) [6,16,20–23].



Figure 1. The significance of kinetics and timescales in bio-nano interactions.

This review is centered on the kinetics and timescales of bio–nano interactions. Specifically, we illustrate some relevant timescales in biology and nanomedicine (Section 2), provide a concise overview of the fundamentals of binding kinetics (Section 3), briefly describe a few measurement techniques (Section 4), discuss the kinetics of NP–protein interactions and the dynamics of protein corona formation (Sections 5–7), and conclude by providing a brief overview of potential areas requiring further development and exploration (Section 8).

2. Kinetics and Timescales in Biology

Biological processes are regulated by a complex network of interactions in both time and space. To illustrate the temporal aspects of biological regulation, Table 1 presents a selection of characteristic timescales observed in various biological contexts [18,24–30].

Event	Timescale	Comment	Ref.
Protein diffusion	1–10 s	Protein diffusion across a 10 µm diameter cell	[18]
Cell movement	1 μm/min	HeLa cells	[18]
Cell cycle	1 day	HeLa cells	[18]
Protein folding	1 ms to 1 min	Most proteins fold on timescales of the order of milliseconds	[18,29]
Natural antibody-antigen residence time (RT)	1 h	Longer RTs do not provide selective advantage	[24]
Clathrin-mediated endocytosis	1 min	HeLa cells	[18]
Cellular uptake and lysosomal degradation of LDL particles	60 min	Fibroblasts	[30]
LDL receptor recycling	10 min	Time between LDLR internalization and recycling to the plasma membrane	[30]
Turnover of plasma membrane	0.5 h to 2 h	Time it takes for cells to endocytose the area equivalent of their entire plasma membrane	[26]
Plasma halflives (t _{1/2}) of large proteins (MW > 60 kDa)	Several hours to days	HSA and IgGs have exceptionally long $t_{1/2}$; in humans, HSA has a $t_{1/2}$ of 19 days and IgGs of 1–4 weeks	[25,27]

Table 1. Selection of characteristic timescales observed in various biological contexts.

Event	Timescale	Comment	Ref.
Plasma halflives of small proteins (MW < 60 kDa), e.g., growth factors	A few minutes to a few hours	Clearance through degradation and renal filtration	[25,27]
Residence time for drug–receptor binding	0.2 min to 35 h	Residence times for selected therapeutically relevant drugs bound to their GPCR targets	[28]
Plasma halflives of therapeutic drugs and protein biologics	A few minutes to a few hours	Clearance through renal filtration, degradation, and hepatic elimination	[25]

Before proceeding, it is instructive to address the concept of drug-receptor binding kinetics within the field of pharmacology, as it highlights the significant role of timescales in practical scenarios. Namely, the timescales associated with drug-receptor binding and unbinding have emerged as valuable predictors of in vivo drug efficacy, sometimes surpassing traditional equilibrium potency measures like binding affinity and half-maximal inhibitory concentration (IC₅₀) [19,31,32]. Specifically, drugs exhibiting prolonged drug target residence times can elicit durable therapeutic effects, even when most of the drug has been eliminated from the body. Drug rebinding to its cognate receptor presents an additional mechanism that enhances the duration of target occupancy, consequently prolonging the clinical action of the drug [33,34]. On the other hand, when the plasma drug halflife exceeds the drug target residence time, target occupancy is primarily governed by simple mass balance effects [35]. The significance of the drug target residence time concept extends to drug toxicity. On one hand, a prolonged residence time enables the optimization of dosing schedules to minimize off-target toxicities. However, too long a drug target residence time could lead to on-target toxicity, making a shorter residence time desirable in such scenarios [19].

To conclude, research has shown that integrating drug–target binding and unbinding kinetics, alongside consideration of established pharmacokinetic parameters such as drug distribution, metabolism, and elimination, is paramount for optimizing the clinical effectiveness of therapeutic drugs within the dynamic in vivo system [19,31–34,36,37].

3. Fundamentals of Binding Kinetics

Here, we provide a brief overview of the kinetics of protein–protein interactions, which serves as a foundation to describe NP–protein interactions (Sections 5–7). We begin by introducing the simplest model of a single-step binding reaction (Figure 2A) involving receptor (R) and ligand (L) proteins:

$$R + L \stackrel{k_{on}}{\underset{k_{off}}{\rightleftharpoons}} RL \tag{1}$$

where k_{on} (units of M⁻¹s⁻¹) and k_{off} (units of s⁻¹) represent the association and dissociation rate constants of the forward and reverse reactions, respectively, and $K_D = k_{off}/k_{on}$ is the equilibrium binding affinity.

The rate of the forward reaction, k_{on} , is constrained by diffusion and has an upper limit of approximately $10^9 \text{ M}^{-1}\text{s}^{-1}$, which is known as the Smoluchowski limit [38,39]. However, proteins impose strict geometric constraints in forming the correct binding interface, resulting in a maximum k_{on} of around $10^5-10^6 \text{ M}^{-1}\text{s}^{-1}$, which is defined as the basal rate of association [39,40]. It is worth noting that additional processes, like favorable electrostatic interactions and desolvation of hydrophobic patches, can enhance the rate of association beyond the basal level, leading to k_{on} values exceeding $10^6 \text{ M}^{-1}\text{s}^{-1}$ [41]. On the other hand, desolvation of polar/charged residues and conformational changes decrease the k_{on} relative to the basal level, resulting in k_{on} values lower than $10^5-10^6 \text{ M}^{-1}\text{s}^{-1}$ [39–41]. With regards to the unbinding rate, k_{off} , it defines the residence time (t_r) of the RL complex, where $t_r = 1/k_{off}$. The magnitude of the k_{off} is controlled by short-range interactions at the binding interface, including hydrogen bonds, salt bridges, van der Waals forces, and hydrophobic interactions.



Figure 2. Free energy profiles characteristic of (**A**) one-step and (**B**) two-step binding reactions between receptor (**R**) and ligand (**L**) proteins. The free energy of binding is indicated by ΔG_D . See text for additional details.

Under pseudo first-order conditions (i.e., [L] >> [R]), formation of the RL complex from the isolated components proceeds with an observed rate constant, k_{obs} , as such:

$$k_{\rm obs} = k_{\rm on}[L] + k_{\rm off} \tag{2}$$

The resulting observed association halftime, t_{obs} , is expressed as $t_{obs} = \ln 2/k_{obs}$. Thus, the speed of a binding reaction can be influenced by either k_{on} , k_{off} , or both, dependent upon the concentration of the ligand and the magnitude of the kinetic parameters. Three cases can be considered [42]: (i) for high-affinity interactions where [L] > K_D , the reaction rate, k_{obs} , predominantly relies on the product, k_{on} [L]; (ii) for weak interactions where [L] < K_D , the reaction rate is primarily dictated by k_{off} ; and (iii) when [L] ~ K_D , then both k_{on} [L] and k_{off} contribute to k_{obs} .

For more comprehensive insight into the kinetics of protein interactions, it is useful to consider the presence of an intermediate state within the reaction pathway (Figure 2B). This intermediate state, referred to as the encounter complex (EC), remains predominantly solvated and retains nearly native separations and orientations. Subsequent steps of desolvation and conformational changes within the EC lead to the formation of the final bound state [39–41]. These events can be represented as follows:

$$R + L \stackrel{k_1}{\underset{k_{-1}}{\rightleftharpoons}} RL^* \stackrel{k_2}{\underset{k_{-2}}{\rightleftharpoons}} RL$$
(3)

where RL* represents the EC, k_1 is the diffusion-controlled rate of formation of the EC, k_{-1} is the rate of dissociation of the EC, k_2 is the rate of conversion of the EC into the final bound state, and k_{-2} is the rate of dissociation of the bound state back to the EC. Values of k_1 can theoretically span the range from ~10⁵ M⁻¹s⁻¹ (the second-order basal rate of association, as defined above) to 10⁹ M⁻¹s⁻¹ (the Smoluchowski rate constant).

For the two-step binding reaction described above (Equation (3)), the observed rate constant of complex formation is given by the following:

$$k_{\rm obs} = \frac{k_2[L]}{K_1 + [L]} + k_{-2} \tag{4}$$

Under steady-state conditions, the overall rate constants of association and dissociation of the two-step binding reaction are governed by the kinetics of each discrete reaction step, as follows:

$$k_{\rm on} = \frac{k_1 k_2}{k_{-1} + k_2} \tag{5}$$

$$k_{\rm off} = \frac{k_{-1}k_{-2}}{k_{-1} + k_2} \tag{6}$$

These equations delineate two limiting regimes [39,40]. For a diffusion-controlled reaction, the conformational rearrangement is fast relative to dissociation of the EC, that is, $k_2 >> k_{-1}$. Hence, k_{on} can be approximated as $k_{on} \approx k_1$, while $k_{off} \approx k_{-1}k_{-2}/k_2$. On the other hand, when complex formation is reaction-limited, the intermediate step of conformational changes proceeds slowly, that is, $k_2 << k_{-1}$, and the approximations $k_{on} \approx k_2k_1/k_{-1} = k_2/K_1$ and $k_{off} \approx k_{-2}$ apply. Furthermore, the expression for K_D is given by the following:

$$K_{\rm D} = \frac{k_{-1}k_{-2}}{k_1k_2} = K_1K_2 \tag{7}$$

For reaction-limited association, it becomes apparent that the overall K_D equals the affinity of the encounter complex, K_1 , multiplied by the factor K_2 ($K_2 < 1$) accounting for the subsequent tightening steps of desolvation and conformational changes.

4. Measurement Techniques

This section provides a succinct overview of the primary experimental techniques used to evaluate binding kinetics. These include the manual mixing technique and stopped-flow spectroscopy as solution-based methods, as well as surface plasmon resonance (SPR) spectroscopy as a surface-based technique. For further in-depth information on these techniques (including data collection, modeling, and interpretation), readers are directed to specialized texts [44–46].

It should be acknowledged that there are additional methods that can provide highly specialized and valuable insights into interaction kinetics and the dynamics of protein corona formation. In particular, single-molecule-based methods can offer a detailed mechanistic understanding of protein–surface interactions, although their application in the study of NP–protein interactions is still emerging [47–49]. In addition, the application of super-resolution microscopy and single-molecule imaging enables the exploration of protein corona formation and evolution on a particle-by-particle basis [50,51]. This approach offers a unique opportunity to visualize and understand the issue of heterogeneity in protein adsorption. In future, widespread application of these advanced methods is expected to provide novel insights into NP–protein interactions, hence complementing the more conventional ensemble-based approaches.

4.1. Solution-Based Techniques

The simplest solution-based approach to study NP–protein interaction kinetics is the manual mixing technique. This method is especially well-suited for studying slow reactions with time constants ranging from several minutes to several hours. Interactions can be monitored in real-time by following changes in optical signals, such as fluorescence emission. Alternatively, the bound or unbound protein mass can be directly quantified using calorimetric assays at specific time points, typically following centrifugation to separate unbound proteins from NP–protein complexes. The manual mixing technique can be used to measure the kinetics of protein corona formation when it occurs slowly under given experimental conditions [52,53]. In general, however, this method has limited applicability in measuring NP–protein association kinetics due to the rapid nature of protein adsorption and corona formation. On the other hand, the manual mixing technique can be highly effective for examining protein dissociation from NP surfaces [54], which in the case of strong interactions, can last for several hours or even days. The dissociation reaction can be induced by either dispersing NP–protein complexes in a protein-free buffer solution or through competitive displacement of adsorbed labeled proteins via excess unlabeled proteins in a solution. It is important to recognize that these different methods may yield varying conclusions regarding the dissociation kinetics [55]. At any rate, the obtained signal change over time is typically analyzed by fitting an exponential function to extract the first-order dissociation rate constant, k_{off} . Of note, modeling the dissociation reaction may require a combination of exponential functions for a satisfactory data fit. In such cases, it may or may not be possible to mechanistically assign each determined k_{off} value to a specific NP–protein binding configuration or other underlying phenomena.

Fast interactions occurring within seconds or even milliseconds can be analyzed using mechanical mixing coupled with real-time optical detection. This can be readily accomplished using commercially available stopped-flow spectroscopy systems, capable of achieving dead times of a few milliseconds or less in conjunction with a time resolution on the order of approximately 1 millisecond. Fluorescence stopped-flow spectroscopy is ideal for evaluating fast NP-protein dissociation kinetics in the case of low-stability complexes, such as those formed with ultrasmall NPs (Section 6). Furthermore, the stopped-flow approach could prove valuable in assessing the short residence times of soft corona proteins on the surface of NPs, although to the best of our knowledge, this specific application has yet to be explored. Similarly as described above for the manual mixing technique, more than one exponential function may be required to fit the dissociation reaction. The stopped-flow method is also well-suited for studying NP-protein association reactions, which can occur extremely fast. Importantly, the millisecond time resolution afforded by the technique enables the potential identification of intermediate steps within the reaction pathway, along with a quantification of the rate constants of formation and dissociation of individual species. For example, given a two-step binding reaction as shown in Figure 2B, plotting the observable rate constant for complex formation (k_{obs}) against the ligand concentration ([L]) would yield a hyperbolic curve. Employing the k_{obs} equation (Equation (4)) to fit this experimental curve would then provide the affinity K_1 of the EC, as well as the first-order rate constant k_2 that governs the rate of final complex formation. The k_{-2} rate, in turn, would be best estimated through a competitive displacement assay. While stopped-flow spectroscopy can yield valuable insights into fast binding reactions, it does have certain limitations to consider: the technique relies on changes in optical signals, which may not occur in all interactions, thereby restricting its applicability, as well as low-throughput data collection and high sample consumption.

NMR spectroscopy stands as another important solution-based technique that can provide a wealth of information on the dynamics of NP–protein interactions [56–61]. It also can offer unique details about binding configurations, including interaction epitopes and local/global protein conformations [56,62,63]. For example, Ceccon et al. studied the global motions and exchange kinetics (k_{obs} and k_{off}) of the small protein ubiquitin on the surface of unilamellar liposomes [60]. Their findings revealed a residence time for bound ubiquitin of around 20 µs. Moreover, the bound ubiquitin exhibited internal rotation and wobbling motions on the micro- and nanosecond timescales, respectively. An application of NMR spectroscopy for studying NP–protein association kinetics is further mentioned in Section 5.3. Readers are referred to specialized texts for more in-depth information on this technique [56,57,59].

4.2. Surface-Based Techniques

Surface-based methods used to evaluate binding kinetics include label-free biosensor technologies such as SPR spectroscopy, biolayer interferometry, optical waveguide light-mode spectroscopy (OWLS), grating-coupled interferometry, and quartz crystal microbalances [64]. The label-free nature of these methods eliminates the need of conjugating extrinsic reporter molecules (like fluorescent probes) to the binding partners. Among the various available techniques, SPR is the best-known and most extensively used [45]. Therefore, the comments that follow pertain to SPR. In SPR, one of the binding partners, termed the 'ligand', is immobilized on a sensor 'chip' within a flow cell, while buffer solution containing the 'analyte' continuously flows over the surface. Interactions between the applied analyte and immobilized ligand are monitored in real-time by detecting signal changes (refractive index changes) through the sensor 'chip'. The apparent k_{on} and k_{off} interaction rate constants are then determined by fitting a suitable binding model equation to the obtained kinetic data.

The kinetic constants that can be determined using SPR cover a wide range, from around 10^2 to 10^6-10^7 M⁻¹ s⁻¹ for association rate constants and from 10^{-5} to 1 s⁻¹ for dissociation rate constants. The exact range depends on the particular system and experimental conditions. Accurate measurement of very fast association reactions is hindered by mass transport limitations, which involve the diffusion-controlled delivery of the analyte from the bulk solution to the surface. Likewise, characterization of very fast dissociation reactions is hindered by analyte rebinding to the immobilized ligand (also a manifestation of mass transport limitation), that is, the analyte rebinds to the surface before it has time to diffuse away from it. Conversely, very slow dissociation reactions lasting from many hours to days are limited by the extended time required for data collection.

Previous studies have conducted systematic comparisons between SPR and solutionbased techniques for quantifying biomolecular interactions [65]. It has been concluded that SPR is generally able to provide reliable results. However, this reliability depends on addressing several factors [45,66–68]. Firstly, SPR is susceptible to mass transport limitations, as already noticed. Secondly, SPR can be influenced by inherent sources of binding heterogeneity. These sources can include, among others, changes in the binding properties of the immobilized ligand due to interactions with the surface, effects of chemical crosslinking, avidity effects, and spatial variations in surface properties at the microscopic scale. Indeed, it has been shown that even biomolecular interactions conforming to a 1:1 binding scheme in a solution may exhibit significant binding heterogeneity when evaluated using SPR [66–68]. Nonetheless, these issues can be mitigated to some extent through well-planned experiments and the adoption of data analysis methods that account for surface heterogeneity [66,67].

To quantify NP–protein interactions, it is advisable to explore various immobilization strategies, including the use of both the NP and the protein as immobilized ligands. In the first scenario, multiple proteins can bind to a single immobilized NP. This set-up can be particularly useful for investigating both strong and weak protein interactions with the NP surface [6,69,70]. It is also crucial to carry out experiments with varying levels of surface immobilization. As a rule of thumb, it is best to immobilize the minimum possible amount of ligand (while ensuring a sufficient signal-to-noise ratio) to mitigate mass transport limitations and the potential for avidity effects.

As a final note, it is important to recall that NP–protein complexes may exhibit inherent sources of binding heterogeneity, as discussed in Section 5.2. Therefore, distinguishing the true binding heterogeneity intrinsic to the interaction from that introduced artificially by surface immobilization can present a challenge.

5. Kinetics of Protein Interactions with 'large' NPs

In this review we distinguish between two primary categories of NPs based on their size: 'conventional' or 'large' NPs with sizes typically greater than 10 nm, and ultrasmall NPs (usNPs) with sizes smaller than 3 nm [71,72]. In this section, we explore the kinetics of binding and unbinding of individual proteins with conventional NPs, while the dynamics of protein corona formation in complex biofluids are discussed in Section 7. Section 6 is dedicated to exploring protein interactions with usNPs.

5.1. Interaction Mechanism

It is instructive to consider NP–protein interactions in analogy to the kinetic mechanism of protein–protein complexation, as described in Section 3 (Figure 2). However, this analogy assumes only direct NP–protein interactions and neglects the occurrence of interprotein interactions and other secondary phenomena. Accordingly, NPs and proteins undergo random collisions in a solution until they bind in the proper orientation, forming a first-encounter complex with a second-order rate constant, k_1 . The magnitude of k_1 is expected to approach the Smoluchowski diffusion limit, that is, $k_1 \approx 10^8-10^9$ M⁻¹ s⁻¹, depending on NP size. This is primary because NPs are considered spherical and uniform, which means that formation of the proper binding interface depends only on the orientational constraint imposed by the protein itself [73]. The encounter complex can undergo partial desolvation of polar groups and interfacial restructuring (local protein structural changes) characterized by the first-order rate constants k_2 , k_3 , and so on along the reaction pathway. The energy barriers associated with these processes slow down the overall association reaction. Simultaneously, the tightening steps of desolvation and interfacial restructuring collectively lower the free energy of the system toward a more stable final state. The final complex can be stabilized by a combination of van der Waals forces, hydrogen bonds, electrostatic interactions, and hydrophobic effects, with the relative importance of each interaction depending on the specific NP and protein characteristics [74].

Assuming a three-step binding reaction for simplicity (Figure 3), it can be hypothesized that the initial interfacial restructuring occurs rapidly ('large' k_2), accompanied by modest alterations in the native protein structure, leading to reversible adsorption ('large' k_{-2}). Subsequently, slower and more extensive structural rearrangements may take place ('small' k_3), ultimately contributing to the 'irreversible' adsorption of proteins ('small' k_{-3}). According to this view, proteins can undergo a transition from reversible to irreversible adsorption on the surface of NPs over time [75,76]. However, as emphasized in a recent comprehensive review, proper quantitative assessment of this reversible-to-irreversible transition is hindered by the scarcity of available published data [55]. Certainly, for certain NP types, the interactions may be best described as a two-step process, in which case slower protein denaturation steps are absent and a reversible NP–protein complex is formed. Another potential scenario involves the occurrence of some structural changes over time, but which may not contribute to further complex stability, thus preventing the transition to irreversible binding.



Step 1: Formation of the encounter complex Step 2: Desolvation, ion removal, structural changes Step 3: Additional structural changes



Figure 3. Illustration of a three-step binding reaction between protein and NP. (**A**) Schematic representation and (**B**) free energy profile of the three-step binding reaction.

Secondary phenomena, including interprotein interactions and steric effects, add complexity to the adsorption process. For example, proteins that arrive late at the NP surface encounter limited available area for adsorption. Consequently, there may be a significant reduction in the value of k_1 and, by extension, in the overall k_{on} rate constant. Furthermore, these proteins have restricted space to spread out and form strong bonds with the NP surface, which may result in reversible adsorption [14].

In conclusion, the molecular mechanisms underlying NP–protein interactions are inherently complex, as they are influenced by numerous physicochemical and environmental factors. In this respect, kinetic studies play a crucial role in providing mechanistic insights into NP–protein complexation.

5.2. Dissociation Kinetics and Residence Times

According to the general model for NP–protein complexation presented above, the overall k_{off} rate constant is a combination of the rate constants of the individual reaction steps. For 'truly irreversible' adsorption, the apparent k_{off} should be around 10^{-5} s⁻¹ or less, corresponding to a residence time of approximately 27 h or longer. In some cases, the individual off-rate constant of the last reaction step may serve as a reasonable approximation of k_{off} . It is also possible that intermediate stages in the reaction pathway might potentially yield a stable complex within biologically relevant timescales. In this context, subsequent stages of conformational rearrangements could induce further protein denaturation without yielding a biologically advantageous extension in residence time.

Based on the current literature, it is clear that both reversible and irreversible complexation can occur between proteins and NPs. For instance, Wang et al. observed irreversible binding of transferrin to hydrophobic polystyrene (PS) NPs, whereas reversible binding was detected when using hydrophilic carboxyl-functionalized PS NPs [75]. In contrast, a previous study by Milani et al. reported that binding of transferrin to similar types of PS NPs was irreversible [77].

The distinction of NP–protein complexes as either 'reversible' or 'irreversible' is, of course, an oversimplification. There is actually a continuum of NP–protein complex residence times encompassing a biologically relevant range that extends from seconds to hours, or even days. Previous studies have conducted quantitative assessments of the binding and unbinding kinetics between individual proteins and 'conventional' NPs [6,54,61,77–89]. Figure 4A presents a compilation of the apparent k_{on} and k_{off} rate constants obtained from these investigations (for individual values, refer to Supplementary Table S1). In some studies, only k_{off} values have been determined, and these are included in Figure 4B. The majority of measurements have been performed using SPR spectroscopy. Determination of the rate constants using various solution-based methods has yielded comparable outcomes, although with limited studies available in this regard.

Examining the k_{off} values in Figure 4B for conventional ('large') NPs reveals a broad range, spanning from approximately 1 to 10^{-5} s⁻¹. This translates to residence times spanning from 1 s to 28 h. It is interesting to note that, among the 58 entries in Figure 4B, 11 exhibited k_{off} values greater than 10^{-2} s^{-1} characteristic of transient interactions ($t_{\text{r}} < 100 \text{ s}$), whereas only 7 entries displayed k_{off} values smaller than 10^{-4} s^{-1} , indicating more stable interactions ($t_r > 2.7$ h). The majority of the data (40 entries) were associated with intermediate k_{off} values between 10^{-2} and 10^{-4} s⁻¹. Further examination of Supplementary Table S1 unveiled that, among the 11 cases pertaining to transient interactions, 7 corresponded to liposome or lipid NPs, 1 case was related to the soft corona, and only 3 were linked to other NP classes. These observations could potentially suggest that soft NPs, such as liposome and lipid NPs, tend to form less stable interactions with proteins when compared to other NP classes. However, the limited number of studies performed to date precludes making definitive conclusions regarding the influence of NP 'softness' and other crucial physicochemical parameters on the residence time of NP-protein complexes. Thus, additional studies are clearly needed to provide a more comprehensive understanding of these dynamics.



Figure 4. Compilation of NP–protein interaction kinetics data. (A) k_{on} and k_{off} rate constants for both large and ultrasmall NPs. Dashed lines delineate distinct K_D values in the k_{on} – k_{off} plot. (B) Compilation of k_{off} rate constants and corresponding t_r values for large and ultrasmall NPs, including studies with k_{off} data only. Dark green triangles refer to interactions between functional usGNPs and their target receptor (see text for details). Specific values of the rate constants are provided in Supplementary Tables S1 and S2.

It is important to acknowledge certain limitations of SPR when it comes to determining dissociation kinetics, some of which are also relevant to other characterization techniques. Firstly, a given apparent k_{off} rate constant obtained through SPR provides only an average representation of the dissociation process. In reality, the bound proteins can exhibit a range of k_{off} values, which in turn can be influenced by several factors, such as NP surface heterogeneity, lateral interprotein interactions, distinct binding orientations, and steric effects. Secondly, the determination of the k_{off} from SPR typically proceeds after completion of the association phase, which normally spans from a few minutes to about an hour. Hence, SPR experiments generally do not assess the impact of incubation time and long-term protein denaturation on the dissociation of NP–protein complexes. Thirdly, protein dissociation is measured in SPR via washing the NPs with pure buffer, but it should be noted that bound proteins may exhibit higher rates of dissociation if they are competitively displaced by other soluble proteins that have stronger binding affinities to the NP surface [14,55].

Several studies have reported the formation of protein multilayers on the surface of NPs [50,77,90–92]. The process of multilayer formation is mediated by interprotein interactions between a strongly bound first layer ('hard' corona) and a loosely bound second layer ('soft' corona). Milani et al. used fluorescence correlation spectroscopy size measurements to investigate protein multilayer formation on model PS NPs [77]. They reported that transferrin initially formed a strongly bound monolayer, followed by the formation of a weakly bound secondary layer. Notably, the residence time associated with the second layer was estimated to be in the range of seconds ($k_{off} >> 1 \text{ min}^{-1}$), as determined by competitive displacement of a labeled soft corona with excess unlabeled transferrin. On the other hand, some authors argue against the prevalent occurrence of multilayer coronas for individual proteins [14,93].

Figure 5 provides a summary of the various factors discussed above that have the potential to influence the kinetics of protein dissociation from the surface of NPs.



Figure 5. Potential factors that may influence the kinetics of protein dissociation from the surface of NPs.

5.3. Association Kinetics

The kinetics of NP–protein association (k_{on}) have primarily been investigated using SPR spectroscopy. Again, it is important to acknowledge certain limitations linked to SPR, some of which might extend to other characterization techniques as well. Firstly, SPR cannot reliably measure very high rates of association, typically having a practical limit around $10^{6}-10^{7}$ M⁻¹s⁻¹. Secondly, proteins may exhibit a range of association kinetics influenced by factors like NP surface heterogeneity, interprotein interactions, and steric effects, among others, but which might not be distinguishable individually. Thirdly, the limited temporal resolution achievable with SPR precludes the identification of intermediate steps within the reaction pathway. Hence, the experimental finding of a single apparent k_{on} rate constant may oversimplify what could be a very complex binding reaction.

Figure 4A presents apparent k_{on} values obtained for various proteins and conventional NPs, spanning a range from 2×10^2 to 7×10^6 M⁻¹ s⁻¹. However, for the majority of the data, the k_{on} values are lower than 10^5 M⁻¹ s⁻¹. These lower k_{on} rates are significantly smaller than the estimated diffusion-controlled association rate of 10^8-10^9 M⁻¹ s⁻¹ for NP–protein interactions. In these cases, NP–protein association is reaction-limited, that is, binding must overcome one or more energy barriers associated with desolvation/ion removal and structural rearrangements.

The rate constants k_{on} and k_{off} , along with the concentrations of the interacting partners, fundamentally govern the timescale of NP–protein association (t_{obs}). Assuming pseudo first-order kinetics for simplicity and strong interactions where [L] > K_D , then $t_{obs} \approx (k_{on}[L])^{-1}$. For example, considering a protein concentration of 100 nM and a $k_{on} = 10^4 \text{ M}^{-1} \text{ s}^{-1}$, the resulting t_{obs} would be 16 min. If the k_{on} were 100-fold greater, the t_{obs} would reduce to just 10 s. On the other hand, with a smaller k_{on} of $10^3 \text{ M}^{-1} \text{ s}^{-1}$, t_{obs} would extend up to 2.7 h. This extended duration could hold significant implications for the dynamics of hard protein corona formation in vivo, although the real scenario within biological fluids is undoubtedly more complicated. In contrast, in cases of soft corona formation, both t_{obs} and t_r would be small (in the order of minutes, seconds, or even less), meaning that the bound soft corona would undergo dynamic exchange with the other proteins in the solution.

To characterize the t_{obs} of NP–protein association in cases involving protein mixtures, Xu et al. implemented the SOFAST-HMQC NMR technique combined with the use of a tryptophan reference standard [58]. Their experiments focused on the model proteins ubiquitin and GB3 competing for the surface of 15 nm gold NPs. For both proteins, a significant amount of binding occurred within the experiment dead time (< 5 min). Nevertheless, it was observed that initially adsorbed ubiquitin was slowly displaced by GB3, with GB3 adsorption and ubiquitin desorption taking place with similar time constants of approximately 140 min. This example highlights the ability of multidimensional NMR spectroscopy to resolve individual residues associated with different proteins, thus providing the potential for studying competitive binding kinetics within protein mixtures.

To conclude, knowledge of the k_{on} provides insights into association mechanisms, such as whether a given interaction is diffusion- or reaction-controlled. However, more detailed mechanistic analysis requires monitoring the association process at a high time resolution (e.g., with stopped-flow spectroscopy) to identify individual reaction steps [86,94]. In practical scenarios, knowledge of the apparent k_{on} is useful for estimating association times, as exemplified above. Unfortunately, accurately determining the k_{on} for NP–protein interactions is not straightforward.

6. Kinetics of Protein Interactions with Ultrasmall NPs

Ultrasmall NPs (d < 3 nm) are characterized by dimensions comparable to or smaller than those of a typical globular protein of 3 to 6 nm in diameter [71,72,95]. Similarly as described above for large NPs, it is informative to consider usNP–protein interactions in analogy to protein–protein interactions [96–98]. Here, the analogy becomes even more pertinent due to the small size and high surface curvature of usNPs, which provide a limited binding interface for protein interactions. Hence, when proteins interact with usNPs, significant protein spreading and denaturation on the usNP surface are unlikely [99–101], and major lateral interactions between bound proteins are also improbable. In fact, usNPs with a diameter of 1.5 nm or less may be so small as to bind only to a single protein (Figure 6A) [95].

Ultrasmall NP–protein interactions often result in the formation of short-lived complexes (Figure 6A). For instance, Boselli et al. employed an agarose gel-shift assay to study the stability of ultrasmall gold NP (usGNP)–protein complexes formed in human plasma [102]. They found that 2 nm PEG-coated and carboxyl-terminated usGNPs exhibited minimal signs of protein interaction, whereas even a slight increment in particle size (from 2 to 3 nm) resulted in the formation of more stable complexes.

Using SPR and fluorescence stopped-flow spectroscopy, Lira et al. and Ferreira et al. carried out quantitative analyses of the binding kinetics of purified proteins with anionic usGNPs [73,96,103–106]. The proteins used in their studies included α -thrombin, CrataBL, ubiquitin, and factor XII (FXII). Their findings indicated k_{off} values within the narrow range of 0.015 to 0.5 s⁻¹, corresponding to t_r values from 2 to 66 s (Supplementary Table S2). These outcomes align with the concept of transient and short-lived interactions between proteins and usNPs. Figure 4B, in particular, clearly illustrates the distinct ranges of k_{off} and t_r that are characteristic of ultrasmall versus conventional NPs. Of note, one should bear in mind that certain types of usNPs may exhibit enhanced binding stability and longer residence times, including functional usNPs [107–110], dendrimers with exceptionally high charge densities, or hydrophobic carbon NPs like fullerenes.

Lima et al. further assessed the residence times of usGNP–protein complexes qualitatively as a function of the incubation time [99]. The panel of proteins encompassed serum albumin, thrombin, chymotrypsin, trypsin, and FXII. Their findings demonstrated that interactions between proteins and usGNPs resulted in reversible complexes, regardless of incubation time (10 min vs. 24 h). In other words, there was no observed time-dependent enhancement in the stability ('hardening') of these interactions.

The near lack of irreversible nonspecific protein binding to usNPs presents an opportunity to engineer functional usNPs that can retain their functionality in complex biological fluid [107,109–114]. Moreover, the ability to attach multiple functional moieties to the usNP surface opens up the possibility to exploit avidity effects, enabling high-affinity and long-lasting interactions between functional usNPs and their receptors. In this context, Seiler et al. designed an effective inhibitor for the survivin protein by immobilizing tweezer macromolecules on the surface of usGNPs [110]. Characterization using SPR demonstrated that these functional usGNPs formed long-lasting complexes with their target receptors influenced by avidity effects, resulting in characteristic residence times of 0.45 and 2.3 h depending on the design (Figure 4B, dark green triangles).

Studies have also explored the association kinetics of usNP-protein interactions. In particular, Lira et al. and Ferreira et al. employed SPR spectroscopy to quantify the apparent $k_{\rm on}$ for CrataBL and thrombin binding to model usGNPs that were surface-coated with either *p*-mercaptobenzoic acid (AuMBA) or glutathione (AuGSH), respectively [73,103]. While both surface ligands featured a COO⁻-exposed surface group, GSH also possessed an additional zwitterionic group (COO⁻/NH₃⁺) at the opposite end of the molecule. This distinction translated into a ~100-fold difference in the measured k_{on} , namely, $k_{on} \sim 10^6$ and $10^4 \text{ M}^{-1}\text{s}^{-1}$ for protein binding to AuMBA and AuGSH, respectively. The disparity in $k_{\rm on}$ was attributed to the presence of a larger energy barrier for protein association with AuGSH. Computer simulations were employed to address the chemical nature of this barrier, revealing a greater energy penalty for the removal of interfacial ions from the more complex counterion atmosphere surrounding AuGSH. In another study, stoppedflow spectroscopy was used to characterize the association kinetics between ubiquitin and AuMBA with a millisecond time resolution [96]. The results supported a multi-step reaction mechanism. In essence, complexation proceeded via formation of an electrostatically stabilized and weakly bound EC characterized by an affinity constant K_1 of approximately 9 μM. EC formation was followed by discrete tightening steps of partial desolvation/ion removal and structural rearrangement, which collectively enhanced the affinity of the final bound state by nearly 100-fold, leading to an apparent K_D of 0.1 μ M. Furthermore, it is interesting to note that the dissociation rate constant of the EC can be estimated from the expression $k_{-1} = K_1 \times k_1$, with $k_1 \approx 10^8 \text{ M}^{-1} \text{s}^{-1}$. For the present case, this gave $k_{-1} \approx 900 \text{ s}^{-1}$, which translated into a residence time for the EC of only 10^{-3} s.

From Figure 4A, it becomes evident that certain usGNP-protein interactions can exhibit relatively high overall k_{on} rate constants (>10⁶ M⁻¹s⁻¹), resulting in considerable binding affinities (low nM range) while displaying short residence times (few seconds). Therefore, under conditions of high particle concentration ([usGNP] > $K_D \ge$ [protein]), which are common in some in vitro assays, most proteins are complexed with usGNPs driven by simple mass balance effects. On the other hand, under conditions of large excess protein, such as in vivo, usGNPs undergo constant binding and unbinding events with different proteins rather than forming long-lasting complexes with any single protein. In this scenario, the k_{off} (or t_r) can become as important as the K_D in shaping the safety profile and bioresponses of the usGNPs (Figure 6B). A case in point is the interaction between AuMBA and FXII, a constituent of the contact system of coagulation. Lira et al. showed that transient AuMBA–FXII interactions ($K_{\rm D}$ ~200 nM; $t_{\rm r}$ ~10 s) were capable of activating FXII and triggering the coagulation cascade in human plasma [106]. Notably, the activation of FXII took place despite a ~1500-fold lower concentration of FXII relative to serum albumin. The cell uptake of usNPs, particularly under conditions of excess protein, constitutes another domain where specific ranges of k_{off} (or t_r) can hold significance. In this context, Muraca et al. prepared tiopronin-coated usGNPs, which demonstrated transient protein interactions, and investigated their cellular uptake [115]. Their findings unveiled a significant increase in cellular uptake as the serum concentration changed from 10 to 50%. This phenomenon was attributed to the establishment of sufficiently long-lived interactions between the usGNPs and specific serum proteins, leading to receptor-mediated uptake of usGNP-protein complexes (Figure 6C). Overall, manipulating the residence time of usNP-protein interactions by precisely controlling the size and surface composition of usNPs could open up exciting new prospects in nanomedicine. For example, interactions could remain sufficiently transient to mitigate particle toxicity yet persist long enough to facilitate cellular entry via receptor-mediated mechanisms [115].



Figure 6. Ultrasmall NP–protein interactions and residence times. (**A**) Impact of NP size on the residence time (t_r) of NP–protein interactions. (**B**) Potential influence of t_r on the safety profile and bioresponses of usNPs in conditions of excess protein. The parameter τ represents the time beyond which usNP–protein interactions begin to affect protein structure and function. Pristine proteins are shown in light red, while modified proteins are shown in dark red. Ultrasmall NPs bound to proteins are depicted in yellow, while unbound particles are shown in blue. The figure illustrates a single protein type for simplicity, but a similar concept applies to biological fluids. (**C**) Potential impact of t_r on receptor-mediated cellular uptake of usNPs. The figure illustrates usGNP binding to specific soluble proteins, which then interact with membrane receptors to initiate endocytosis within a characteristic timescale of τ_{uptake} . Hypothesis 1: cell uptake is unlikely when $t_r < \tau_{uptake}$. Hypothesis 2: cell uptake becomes possible when $t_r > \tau_{uptake}$. Reprinted with permission from ref. [115] (**C**).

7. Dynamics of Protein Corona Formation in Complex Biofluids

In this section, we address the kinetics of protein corona formation on conventional NPs immersed in complex biofluids, such as fetal bovine serum (FBS), human serum, and human plasma. Despite the intricate nature of biological fluids, it remains valuable from a mechanistic standpoint to consider the dynamic aspects of protein corona formation in terms of similar principles to those outlined above in Section 5.

Typically, the adsorbed corona is categorized as either 'hard' or 'soft', reflecting proteins either firmly or transiently bound to the NP surface [77,116–118]. Additional characteristics of hard and soft coronas are illustrated in Figure 7. From a practical standpoint, proteins that remain attached to the NP surface during centrifugation and washing constitute the hard corona, whereas those proteins that are loosely bound and can be removed during these procedures are identified as part of the soft corona. In a more quantitative approach, the protein corona can be globally characterized in terms of a distribution of apparent k_{off} and t_r values, as illustrated below.



Figure 7. Schematic illustration of hard and soft protein coronas and their main characteristics. (**A**) Protein multilayers: The first adsorbed layer constitutes the hard corona, while additional layers form the soft corona. (**B**) Protein monolayer: Both the hard and soft coronas originate from the same proteins within a single adsorbed layer. In this case, it may be hypothesized that neighboring proteins might restrict the 'hardening' of soft corona proteins by constraining their unfolding on the particle surface. (**C**) Primary characteristics of hard and soft protein coronas.

In 2007, Cedervall et al. published a landmark study, which explicitly introduced the concept of the protein corona [6]. In their work, the authors employed SPR spectroscopy to monitor the overall dissociation of plasma proteins from the surface of copolymer NPs (Figure 8A). The obtained data were best fitted assuming two independent dissociation processes, representing 'weakly' and 'strongly' associated proteins (Supplementary Table S3). More recently, Stordy et al. employed biolayer interferometry to investigate the dissociation of plasma proteins from the surface of gold and liposome NPs [69]. The dissociation kinetics were also modeled assuming independent weak and strong binding modes. Interestingly, the study explicitly investigated the influence of incubation time (from 10 to 120 min) on the apparent k_{off} values. For gold NPs, the dissociation rates decreased as a function of incubation time until approximately 40 min, beyond which the rates stabilized (Figure 8B and Supplementary Table S3). Specifically, for strongly associated proteins, the k_{off} rate constant decreased from 1.8×10^{-4} to $\sim 10^{-7}$ s⁻¹. In other words, it took about 40 min for a truly 'irreversible' protein corona to form on the surface of the gold NPs. For weakly associated proteins in turn, the $k_{\rm off}$ rate constant reduced to $3.4 \times 10^{-4} \, {\rm s}^{-1}$ after 120 min of incubation, resulting in an average t_r of 0.8 h. For liposomes, the trends were similar, except the dissociation rates took much longer to stabilize (Supplementary Table S3).



Figure 8. Kinetics of protein corona formation and dissociation. (**A**) Dissociation kinetics of plasma proteins from copolymer NPs determined using SPR spectroscopy. Left: cartoon of immobilized NPs with interacting proteins and flowing buffer. Right: SPR data presented for more hydrophilic (blue) and hydrophobic (red) copolymer particles. Data were fitted (black lines) assuming independent weak and strong binding modes (Supplementary Table S3). (**B**) Dissociation kinetics of plasma proteins from gold NPs obtained through biolayer interferometry as a function of incubation time. Values of k_{off} were derived assuming weak and strong binding modes (k_{off1} and k_{off2} , respectively). (**C**) In vivo dissociation kinetics of fluorescently labeled serum proteins from silica NPs obtained using differential dynamic microscopy. (**D**) Kinetics of hard protein corona formation. Polyacrylamide gel electrophoresis was utilized to identify hard protein coronas formed from human serum and human blood as a function of incubation time. The graph illustrates the linearized relative protein band intensities plotted against the incubation time. Two kinetic phases can be discerned, with a transition time between phases at around 30 s (vertical lines). Reprinted or adapted with permission from ref. [6] (**A**), ref. [119] (**C**), and ref. [120] (**D**).

Recently, Latreille et al. expanded the investigation of protein corona dissociation kinetics to a model in vivo system employing zebrafish larvae (Figure 8C) [119]. This research introduced differential dynamic microscopy (DDM) in fluorescence-imaging mode for quantifying protein adsorption on NP surfaces. The experiments involved precoating of PS NPs with fluorescently labeled serum proteins, injection of precoated NPs into zebrafish larvae, and subsequent analysis using DDM. It was observed that, within a period of 3 h, the number of preadsorbed labeled proteins on the NP surface decreased by 40%. This decrease indicated an exchange dynamic with circulating blood proteins characterized by

a timescale of 67 min. The authors concluded that the protein corona was long-lived but dynamic in nature.

Apart from examining the dissociation kinetics of the NP protein corona, other studies have focused on how fast a hard protein corona can develop on the surface of NPs [120,121]. Weiss et al., in particular, utilized a microfluidic device that enabled reducing incubation times down to 2 s [120]. Interestingly, their results showed that formation of the hard corona could be kinetically divided into two separate phases, with a transition time between phases at around 30 s (Figure 8D). The adsorption kinetics of phase I was relatively slower than that of phase II. The authors proposed a cooperative mechanism wherein the proteins adsorbed during phase I facilitated the subsequent adsorption process in phase II. These findings suggest a complex kinetic mechanism underlying the formation of a hard protein corona.

To gain a more comprehensive understanding of the protein corona, it is essential to identify its individual protein components and observe how the system evolves over time. According to the Vroman model [122–125], the process initiates with the preferential adsorption of smaller proteins present at higher concentrations, which attach to the NP surface at higher rates. Subsequently, these initially adsorbed proteins are replaced by less abundant but more strongly binding proteins. Importantly, the Vroman model also establishes that larger proteins can accelerate the displacement of smaller ones, which otherwise would not desorb so readily on their own [14]. Over time, a stable adsorbed layer is formed, whose composition typically differs from that of the bulk solution. Additionally, the adsorbed proteins may undergo denaturation, as already discussed.

Several mathematical models have been developed to simulate the dynamics of protein corona formation and the Vroman effect [20,85,126–128]. In one such model by Dell'Orco et al., the time evolution of the interaction between three human plasma proteins (HSA, fibrinogen, and HDL) and a copolymer NP was numerically calculated using experimentally determined association and dissociation rate constants [85]. Later, Sahneh et al. derived a set of analytical simplifying equations that replicated nearly all of Dell'Orco's previous findings [126]. Overall, the simulations and calculations revealed that, during the first 20 s, a metastable corona composition was established, with HSA covering most of the NP surface, followed by HDL and fibrinogen. However, after 4 h, an equilibrium state was attained, with HDL becoming the dominant component, followed by HSA (Figure 9).

The validity of the Vroman effect was critically examined by Tenzer et al., who conducted a comprehensive experimental investigation of the time evolution of the protein corona composition on silica and polystyrene NPs [121]. These authors employed quantitative proteomics to obtain time-resolved profiles of human plasma coronas from time points as early as 0.5 min. Contrary to predictions of the classic Vroman model, the types of proteins forming the corona remained relatively constant over time, but their quantities varied at different time points during plasma exposure (Figure 10). For example, certain proteins exhibited low abundance at both the beginning and end of plasma exposure but reached peak abundance at intermediate times ('peak'-shaped profile); conversely, other proteins showed the exact opposite behavior ('cup'-shaped profile) [121,129]. An independent investigation led by Weiss et al. supported the conclusions of the Tenzer et al. study [120]. Using gel electrophoresis, Weiss et al. showed that human serum was adsorbed irreversibly on silica NPs after just 2 s of exposure and that the adsorbed layer did not significantly change in composition over time. Moreover, Hadjidemetriou et al. also observed 'peak'- or 'cup'-shaped binding kinetics of corona proteins formed in vivo on the surface of liposomal NPs [130]. Collectively, these intriguing findings suggest novel binding kinetics, which challenge more simplified models and underscore the intricate nature of NP-protein interactions within complex biological environments. Potential confounding effects include lateral interprotein interactions, cooperative adsorption, steric effects, protein clustering, and so on. Moreover, Zhdanov proposed a complementary kinetic model for the formation of protein corona within complex biofluids [127]. This model posits an exchange mechanism for protein adsorption, namely, the concerted replacement of attached proteins by proteins from a solution.



Figure 9. Mathematical modeling of protein corona formation process. (**A**) Schematics of protein corona formation. Proteins of type *i* attach to the NP surface with association and dissociation rate constants of $k_{i,on}$ and $k_{i,off}$. On average, a maximum number of *ni* proteins of type *i* can occupy the NP surface. (**B**) Results from numerical simulations illustrating the time evolution of corona formation on copolymer NPs. HSA (red), HDL (blue), and fibrinogen (green) were used as model proteins in the simulations. Left and middle panels capture the first 0.05 and 20 s of simulation, respectively, while right panel depicts 20,000 s of simulation where a stable equilibrium has been reached. Reprinted with permission from ref. [126] (**A**) and ref. [85] (**B**).



Figure 10. Temporal evolution of corona proteins on NPs. Four distinct protein groups were identified based on their time-dependent abundances. Reprinted with permission from ref. [129].

The hard protein corona of NPs has received significant attention in research, while the soft corona remains comparatively less understood. To address this gap, new technological advances have recently emerged to analyze the soft corona [50,70,87,117,131]. On the one hand, techniques have been devised to separate and identify the proteins comprising the

soft corona of NPs within complex biofluids [70,87,131,132]. However, there is still a need to better understand the kinetics governing the formation and dissociation of the soft corona. A recent study by Mohammad-Beigi et al. contributed valuable insights into this aspect [87]. First, these authors identified apolipoprotein H (ApoH) as a major component of the soft corona on silica NPs. Using SPR spectroscopy, they were further able to measure the apparent K_D , k_{on} , and k_{off} for ApoH binding to a preformed FBS hard corona (Figure 11). The results yielded an apparent K_D of 17 µM and a k_{off} of 0.048 s⁻¹, corresponding to an ApoH residence time of 21 s on the hard corona. Despite these latest advances, additional work is needed to characterize the composition, architecture, and dynamics of the soft corona, as well as its biological significance.



Figure 11. Quantitative assessment of soft protein corona association and dissociation kinetics. (**A**) Silica NPs were surface immobilized and precoated with an FBS hard corona. Apolipoprotein H (ApoH) was then flowed over the surface to interact with the corona-coated particles. (**B**) SPR binding traces for ApoH. (**C**) Results of a two-dimensional fit used to calculate the binding parameters. Reprinted with permission from ref. [87].

8. Conclusions and Outlook

This review underscored key aspects of NP–protein binding kinetics, encompassing (i) the role of kinetics in providing insights into the molecular nature of interactions; (ii) common measurement techniques, along with their limitations; (iii) characteristic association and dissociation rate constants governing interactions between individual proteins and NPs; (iv) and dynamics of protein corona formation and dissociation. Despite significant progress in the field, several important questions remain unresolved. Listed below are a few examples of potential areas requiring further development and exploration.

Measurement techniques—Surface-based techniques have predominantly been utilized to quantify NP–protein binding kinetics. However, experiments can vary significantly in the way they are implemented, they are susceptible to potential artefactual sources of binding heterogeneity [67,68], and their reliability is difficult to assess. In this scenario, validation of results becomes particularly important, especially in cases where multiple k_{on} and k_{off} rate constants are reported, and these are attributed to various factors like multiple binding sites, structural changes during binding, and protein multilayers. On a broader scale, the field is in urgent need of new powerful yet user-friendly analytical approaches and characterization techniques that can accurately measure binding affinity and kinetics [7,133–136].

 $K_{\rm D}$ vs. $k_{\rm off}$ —The dissociation rate constant, $k_{\rm off}$, is as important a parameter to characterize as the binding affinity, $K_{\rm D}$ [137]. Furthermore, it should be pointed out that determining the precise $K_{\rm D}$ for NP–protein interactions is challenging and highly prone to error [137–139]. This complexity arises from various factors, including the multisite nature of interactions, uncertainties in quantifying NP concentrations, the heterogeneity in NPs size and surface chemistry, and the dependence of $K_{\rm D}$ determination on the assumption of specific binding models. In contrast, assessing the $k_{\rm off}$ is simpler and more reliable, especially with the use of solution-based techniques. Determination of the $k_{\rm off}$ does not require assuming a binding model, and the dissociation reaction follows a first-order process that is unaffected by NP concentration. Furthermore, the finding of multiple $k_{\rm off}$ values could

offer valuable insights into the occurrence of distinct protein binding configurations on the NP surface. Therefore, measuring the k_{off} alongside K_D should be established as a standard procedure in the characterization of NP–protein interactions.

Hard protein corona—Further investigations focusing on the time evolution of protein corona formation are necessary. It must be emphasized that treating the protein corona as a 'single entity' and evaluating its overall dynamics offers limited predictive insight into NP biobehavior. Instead, it is imperative to delineate the binding and unbinding kinetics of individual proteins on the NP surface, with a specific focus on biologically relevant timescales. Moreover, some studies have suggested that the time evolution of protein corona formation might extend beyond the predictions of the Vroman model [121]. Thus, further investigations are necessary for a comprehensive understanding of this phenomenon. Finally, exploring the evolution of corona composition under conditions of limited NP concentration and excess plasma, which mimics the in vivo situation, is important [4]. This scenario has been observed to favor the binding of fewer types of proteins displaying higher NP surface affinity [140].

Soft protein corona—Recent technological advancements have enabled the identification of the protein composition within the soft corona [70,87,131,132]. Looking ahead, it is also important to understand the dynamics of soft corona formation and dissociation. For example, it is conceivable that residence times of 1 s or 1 min, although both characteristic of soft coronas, could yield significantly distinct biological outcomes.

Linking binding kinetics to biological response—With the availability of more data on NP–protein association and dissociation kinetics, it becomes essential to delineate the impact of specific kinetic ranges on biological outcomes. Notably, the current ranges of determined k_{on} and k_{off} rate constants already span a broad spectrum (Figure 4 and Supplementary Tables S1–S3), and specific values of these constants hold the potential to shape subsequent bioresponses. To exemplify, it is conceivable that a sufficiently prolonged residence time would enable an NP–protein complex to fulfill its intended function (such as endocytosis or signal transduction), but too long a residence time could induce toxic effects stemming from protein denaturation or interference with biochemical pathways. Furthermore, the kinetics of corona formation and evolution need to be systematically linked to NP biodistribution and therapeutic efficacy studies to gain a comprehensive understanding of how the dynamic protein corona influences these critical aspects of nanomedicine [130,141–145].

In conclusion, it is only through a comprehensive understanding of NP–protein interactions, including the kinetics and timescales of protein association and dissociation events, that NPs can be engineered to function predictably within the complex and dynamic in vivo environment.

Supplementary Materials: The following supporting information can be downloaded at: https://www. mdpi.com/article/10.3390/physchem3040026/s1, Table S1. Kinetic parameters of protein interactions with large NPs; Table S2. Kinetic parameters of protein interactions with ultrasmall NPs; Table S3. Kinetic parameters of serum and plasma interactions with large NPs.

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