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Ligand-observed in-tube NMR in natural products research: A review on enzymatic biotransformations, protein-ligand interactions, and in-cell NMR spectroscopy

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Abstract Natural product-observed NMR methods have considerably expanded the potentialities for in-tube NMR monitoring of complex enzymatic biotransformations and investigation of proteinnatural product interactions even in living cells. We review, herein, the significant advantages of ligand-observed in-situ NMR monitoring of enzymatic biotransformations without restoring to laborious and time-consuming chromatographic methods. Emphasis will be given to the potentialities of the use of the NMR bioreactor: (i) to investigate through saturation transfer difference (STD), the capacity of natural products to serve as enzyme substrates, (ii) to monitor multiple biotransformation products of natural products with the use of immobilized enzymes and (iii) to investigate interactions of biotransformed products with protein targets. The use of STD and its variants, transfer effect Noes for PHArmacophore Mapping (INPHARMA) NMR, in conjunction with computational methods, can provide excellent tools in investigating competitive binding modes even in proteins with multiple binding sites. The method has been successfully applied in the study of unsaturated free fatty acids (UFFAs)-serum albumin complexes in which the location and conformational states of UFFAs could not be determined accurately, despite numerous X-ray structural studies, due to conformational averaging. This combined method, thus, may find promising applications in the field of protein-natural product recognition research. The emerging concept of in-cell NMR and recent applications will be discussed since they can provide atomic level insights into natural product-protein interactions in living cells without the need of isotope labelled techniques.

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1. Introduction

Binding of low molecular weight (MW) natural products to proteins can play a major role in biocatalyzed reaction processes, regulation of biological processes cellular metabolism and designing novel bioactive molecules that can modulate protein–ligand and protein–protein interactions. Among the great variety of biophysical techniques, NMR spectroscopy is a primary method that can be used to investigate protein-natural product interactions and their reaction products due to the great variety of techniques that can be applied even at cellular level.

Monitoring of biocatalyzed reactions using NMR spectroscopy, has been of growing interest in research and development in the last few decades. Significant improvements in instrumentation and experimental techniques have made NMR spectroscopy a versatile technique in performing biotransformations not only outside the magnetic field but also by performing bioreactions for in situ monitoring in the NMR tube, without any prior fractionation or isolation of the individual analytes. Significant experimental and computational advances have also greatly facilitated investigation of protein-ligand interactions. There are two main approaches for protein-natural product interactions: the protein-observed and the natural product-observed NMR experiments. In protein-observed methods, the high-resolution 3D structures are resolved with the use of heteronuclear experiments on isotopically labeled (¹³C, ¹⁵N, ²D) proteins, especially for those with MW above 30 kDa. Natural products-observed NMR experiments require significantly less protein without isotope labelling and they are not limited to proteins of low MW. They are based on the modification of ligand NMR parameters, especially nuclear Overhauser effect, in the presence of protein receptors. The NMR parameters are population weighed average of the free and bound states, provided that dissociation constants are between 10⁻³-10⁻⁸ M. Ligand-observed NMR methods have also been utilized to provide atomic level insights into natural products-protein interactions in living cells without isotope labeled techniques.

This review was based on a plenary lecture which was delivered in the International Conference on Applied Chemistry and Biotechnology (ICACB-2022), Jordan, and focuses mainly on the advances in the period 2010–2022 for identification and quantification of enzymatic biotransformations of natural products, investigations of ligandobserved protein-natural product interactions in solution and in living cells.

2. In-tube NMR monitoring of enzymatic biotransformations

¹H NMR spectroscopy has been extensively utilized as a versatile and non-invasive method for monitoring biocatalyzed transformations on purified enzymes, washed cell suspensions and bacterial cultures growing in NMR tubes (Brecker and Ribbons, 2000). There are four approaches for NMR reaction monitoring: (i) placing the reagents into a standard NMR tube; (ii) transfer of the mixture from the reaction vessel to the NMR tube (on-line monitoring); (iii) stopped-flow NMR for rapid kinetics and (iv) rapid injection NMR with the use of probe inserts for quick insertion of reagents into the NMR tubes. The first approach, which does not require specialized NMR equipment, can be conducted in deuterated solvents (due to a small NMR test tube volume) and nondeuterated solvents and has been shown to provide valuable structural and mechanistic information, although, kinetic data are strongly diffusion controlled (Foley et al., 2016).

In-situ-¹H NMR was used to investigate the biosynthetic oxidation, with human UDP- glucose 6-dehydrogenase, of UDP-glucose into UDP-glucuronic acid (Eixelsberger et al., 2012). The combined use of wild-type enzyme and the Glu¹⁵¹ \rightarrow Gln mutant, which is slow-reacting, showed that the UDP-

glucuronic acid was the only product for both biotransformations. The absence of deuterium at C-5 was interpreted in terms of an intermediate UDP-*gluco*-hexodialdose which is trapped by thiohemiacetal adduct formation without incorporation of solvent deuterium (D_2O).

Kyriakou et al. (2012) reported enzyme-catalyzed regioselective acylation of flavonoid aglycones and a novel rapid ¹H NMR product screening of the reaction products. Although it has been reported in the literature that the Candida antarctica lipase B (CALB) enzyme has no detectable activity in flavonoid aglycones (Chebil et al., 2006; Chebil et al., 2007; De Oliveira et al, 2010; Bidouil et al, 2011), a significant regioselective acylation of the ring B of quercetin (Fig. 1) and narigenin was found by Kyriakou et al. (2012). The reaction was performed with quercetin (3 µmol), vinyl acetate (1 mmol) and 60 mg ml⁻¹ of catalyst in solvent (200 μ L) at 60° C. The reaction products were identified and quantified in the crude extract without any prior fractionation or isolation. The method was based on the resonances of the OH(5) protons, which are strongly deshielded in the region above 12 ppm, due to the formation of a strong intramolecular hydrogen bond interaction with the C(4) = O group of ring C (Fig. 1) (Siskos et al., 2013; 2015; 2017; Kontogianni et al., 2013). The resolution of the OH resonances was significantly improved with the addition of picric acid (Charisiadis et al., 2010; 2012; Nerantzaki et al., 2011) or trifluoroacetic acid (TFA) (Charisiadis et al., 2017; Mari et al., 2019) with line widths $\Delta v_{1/2} \sim 1.5$ Hz (Fig. 2). The OH(5) resonances of unreacted quercetin (Q), 3'-O acetylquercetin (Q1), 10 % yield, and 4'-O acetylquercetin (Q2), 35 % yield, were clearly resolved, although the acylation sites are located eleven and twelve bonds apart. The excellent resolution of the OH(4') and OH (3') of the 3' and the 4'-monoacylated derivatives allowed the application of ¹H-¹³C HSQC and HMBC experiments for the complete assignment of the two derivatives (Fig. 3). For example, OH(4') shows ²J and ³J HMBC connectivities to C(3') and C(5'), respectively, and the H(3'') shows ^{2}J and ${}^{4}J$ HMBC connectivities to C(2'') and C(3'), respectively.

Further improvements of the NMR tube bioreactor were also reported, by confining the immobilized enzyme (CALB) in the bottom of the NMR tube (Chatzikonstantinou et al. 2018; 2020). Although CALB was placed outside the active volume of the NMR coil, it was necessary to increase the resolution of the OH resonances with optimization of the amount of the immobilized enzyme, concentration of acetyl donor and use of low temperatures (Fig. 4). The optimized resolution of the OH resonances ($\Delta v_{1/2} \le 4$ Hz) allowed the real time monitoring of the biotransformation process (Fig. 5).

Compared with the conventional method of monitoring biotransformation products, the NMR tube bioreactor has several advantages:

- (i) Eliminates fractionation, purification and separation steps of the reaction products.
- (ii) Allows rapid optimization of enzymatic reaction conditions.
- (iii) Facilitates kinetic and mechanistic studies.
- (iv) Operates as a high throughput process in mixtures of putative enzymatic substrates.
- (v) The immobilized enzyme can be recycled for several reactions.



Fig. 1 Regioselective acylation of quercetin with the use of CALB (Novozyme 435) leading to two products, Q1 (3'-O-acetyl quercetin) and Q2 (4'-O-acetyl quercetin). The OH(5) proton is implicated in the formation of an intramolecular hydrogen bond that is depicted with a red line (reprinted with permission of The Royal Society of Chemistry, from Kyriakou et al., 2012).



Fig. 2 500 MHz 1D ¹H NMR spectrum of the OH and aromatic regions of the enzymatically obtained monoacylated derivatives of quercetin in DMSO d_6 . The –OH and aromatic spectral regions are illustrated in (A), (B) before and in (C), (D) after the addition of picric acid, respectively. In (C) the absorptions of the OH(5) protons for Q (unreacted quercetin), Q1 and Q2 (Fig. 1) are indicated with arrows (reprinted with permission of The Royal Society of Chemistry, from Kyriakou et al., 2012).

(vi) Can be easily complemented with ligand-observed NMR techniques (see Section 3.2).

Tsagogiannis et al. (2021) performed the in-situ monitoring of the reaction of protocatechuate 4,5-dioxygenase from *pseudarthrobacter phenanthrenivorans* sphe3 with protocatechuic acid (PCA) and gallate (Chatzikonstantinou et al., 2020). After 2 h, approximately 8 % of PCA was converted to the 4-carboxy-2-hydroxymuconate-6-semialdehyde (CHMS) product (Fig. 6ai); after 24 h, the PCA was totally consumed by 4,5-dioxygenase (Fig. 6aii). The reaction product CHMS exhibits characteristic resonances (Fig. 6b) due to keto-enol tautomerization process. The combination of 2D $^{1}H^{-1}H$ COSY, $^{1}H^{-1}H$ TOCSY, 2D $^{1}H^{-13}C$ HSQC and HMBC NMR spectra resulted in the complete resonance assignments for both the keto and enol forms. The equilibrium of the two tautomers was also investigated by the use of variable temperature (290–315 K) ^{1}H NMR



Fig. 3 Selected regions of the 500 MHz ${}^{1}H{}^{-13}C$ HSQC (A) and ${}^{1}H{}^{-13}C$ HMBC (B)–(D) spectra of the solution used in Fig. 2(C). The arrows and cross peaks of importance for the unequivocal assignment of the 3'-and the 4'-monoacylated derivatives of quercetin are colored in red and blue, respectively (reprinted with permission of The Royal Society of Chemistry, from Kyriakou et al., 2012).



Fig. 4 ¹H NMR spectra of in-situ esterification of quercetin catalyzed by CaLB. On a Bruker AV-400 spectrometer: (A) at 333 K, with 30 mg CaLB and 250 μ L vinyl acetate; (B) at 298 K, with 30 mg CaLB and 250 μ L vinyl acetate; (C) at 298 K, with 15 mg CaLB and 125 μ L vinyl acetate. On a Bruker AV-500 spectrometer (D), at 282 K, with 15 mg CaLB and 125 μ L vinyl acetate (reprinted with permission of Elsevier Inc., from Chatzikonstantinou et al., 2020).

spectroscopy in the buffer solution at pH 8, which allowed the accurate determination of $\Delta H^{\circ} = 25.58$ kJ/mol and $\Delta S^{\circ} = 0.10$ kJ/mol K.

Quantitative ¹H NMR (q ¹H NMR) was used to investigate steric and electronic effects of several monosubstituted benzoates as substrates of the Rieske dearomatizing dioxygenases (RDDs) in *Ralstonia eutropha* B9 (Bent et al., 2022). Higher activities were resulted with less bulky substituents, mainly in 3-position. The regioselectivity of the reaction was shown to have positive correlation with increasing size of substituents. These studies could be of importance in the synthesis of substrates for benzoate dioxygenases.



Fig. 5 (A and C) The acetylation of quercetin and naringenin catalyzed by CaLB. (B, D) The real time monitoring of the biotransformation of quercetin and naringenin, respectively (reprinted with permission of Elsevier Inc., from Chatzikonstantinou et al., 2020).

3. In-tube protein-natural products interactions with the combined use of STD, TR-NOESY and INPHARMA/ILOE NMR

3.1. Principles of NMR experiments

3.1.1. STD technique and its variants

The saturation transfer difference (STD) NMR technique (Meyer and Peters, 2003) is based on the nuclear Overhauser effect and has been widely used to characterize ligandreceptor interactions. It is very simple in the implementation and does not require proteins that are labelled with stable isotopes. Since the concentration of the protein is 50 to 1000 times lower than that of the ligands (µM-mM range) there is no need to use bacterial expression systems to produce high protein vields. In cases of problematic solubility of ligands in aqueous buffers, the use of DMSO d_6 (concentration < 5 % v/v) is recommended to achieve concentrations of at least 100-300 µM, depending on the availability of high field instruments and high sensitivity cryoprobes. In the STD experiment the difference spectrum is obtained by subtracting a spectrum where the protein is selectively saturated (on-resonance) with a narrow selective pulse that does not excite the ligand, with signal intensity ISTD, from that without saturation (off-resonance) with intensities I_O (Fig. 7). The difference in intensities $I_{STD} = I_O$ - ISAT of the ligand indicates an unambiguous epitope determination. The STD technique has shown to be efficient in detecting low-affinity ligands even in mixtures of homologues ligands and, thus, a powerful screening tool for characterizing ligand binding (Marcelo et al., 2012; Wagstaff et al., 2013). Thus, numerous STD studies have been published to characterize the binding of carbohydrates to lectins, enzymes and antibodies (Marcelo et al., 2012).

Several variants of the standard STD experiment have been published based on the use of multiple on-resonance frequencies (Monaco et al., 2017; Watt et al., 2018; Monaco et al., 2020). The DiffErential EPitope mapping STD NMR (DEEP-STD NMR) can provide information on the nature of the aminoacids of the binding site surrounding the ligand. Provided that the high-resolution structure of the binding site is known, then, the orientation of the bound ligand can be inferred (Monaco et al., 2017). More recently an Inter-Ligand saturation transfer difference (IL-STD) NMR technique was used to investigate adjacent binding sites of the two ligands (Monaco et al., 2022). The technique is based on the selective proton saturation at a frequency δ^{o} (standard STD version) and a second frequency δ^* to achieve selective saturation of the adjacent reporter ligand (Fig. 8). Significant STD differences of the ligand of the interest, demonstrate through space proximity of the two ligands. It has been claimed that the technique results in considerable saving of experimental time (one tenth) relative to the 2D inter-ligand NOE (see subsection 3.1.2 below).

3.1.2. INPHARMA/ILOE technique

INPHARMA technique (Sanchez-Pedregal et al., 2005; Orts et al., 2008; Carlomagno, 2012) can be utilized to distinguish between competitive and allosteric binding modes of natural products bound to a macromolecular target if the binding



Fig. 6 Biotransformation of PCA (1 mM) by PcaA (8 μ M), inside the NMR tube. (a) ¹H NMR spectra 2 h (blue spectrum, (i)) and 24 h (red spectrum, (ii)) after the addition of PCA to protocatechuate 4,5 dioxygenase. ¹H NMR resonances of the substrate are shown in the blue spectrum. The asterisk (*) denotes protons of imidazole present in the buffer. (b) Expanded region (7.8–9.4 ppm) of the ¹H NMR spectrum of Figure 6aii and the chemical structures of the enol (left) and keto (right) forms (Tsagogiannis et al., 2021).

mode of a second competition ligand is known from high resolution X-ray or NMR structural studies. The method is based on the 2D NOE magnetization transfer between two ligands that interact competitively to the same binding site with inter-ligand distances < 5 Å. The number of intermolecular NOEs can be utilized to obtain the relative positions of the two ligands within the binding pocket (Fig. 9). For the successful implementation of the INPHARMA technique, the two competing ligands should exhibit similar residence times with affinity ratios < 10 (Otts et al., 2009). Despite the above limitations, the INPHARMA technique was found to be extremely useful even in the cases of proteins with multiple binding sites and ligands which exhibit multiple conformations (see discussion below).

If two ligands bind simultaneously, with similar residence time in adjacent binding sites of a protein forming a ternary complex, then, inter-ligand NOEs (ILOEs) can be observed between the protons of ligands 1 and 2 that are in close contact (Fig. 9) (Li et al., 2001; Rademacher et al., 2011; Cala, 2014). For the observation of significant ILOE cross-peaks, mixing times of 600–800 ms are required, which are significantly longer than those used in INPHARMA experiments (70-300 ms) (Cala, 2014).

3.2. Selected applications

Chatzikonstantinou et al. (2018) reported further improvements of the NMR tube bioreactor by introducing three experimental steps (Fig. 10). The first one involves the application of 1D STD experiment to investigate the capacity of mixtures of natural products to serve as enzyme substrates. After identification of the most favorable substrates, the second step is applied for the 1D ¹H NMR monitoring of multiple biotransformation products with the use of immobilized enzymes, as shown in detail in the previous section. The third step involves the evaluation of the interaction of the biotransformation products with specific protein targets.

Fig. 13 illustrates the advantages of the first step of the above method. An STD NMR experiment is applied in a mixture of natural products (quercetin and narigenin) which can serve as substrates for a given enzyme (CALB). Since the other components which are necessary for the biotransformation are not present in the mixture, the STD experiment can provide valuable information on the capacity of a natural product to interact with the enzyme. The STD experiment confirmed that the main interaction of quercetin with CALB is ring B (Fig. 11a). For narigenin, on the contrary, the main interactions are through the 6'' methyl group and 4'' protons of the sugar moiety (Fig. 11b).

Having determined the favorable substrates that interact with CALB, the next step 2 involves the monitoring of multiple biotransformation products with the use of immobilized enzyme in the bottom of the NMR tube. Despite the use of 5 different substrates (luteolin-7-O-glucoside, rutin, narigenin, naringin and quercetin), the monitoring and quantification of 8 reaction products was achieved (Fig. 12). The 3rd step of the NMR tube bioreactor involves the rapid screening of the biotransformation products with the protein target. This step requires the following easily applicable protocol: (i) filtration of the immobilized enzyme; (ii) evaporation of the organic solvent, (iii) addition of the protein target which is dissolved in the appropriate buffer solution and (iv) evaluation with the use of 1D STD NMR of the interaction of the biotransformed products with the target protein.

Alexandri et al. (2022) applied ligand-observing STD, Tr-NOESY and INPHARMA techniques to probe the binding mode of free fatty acids (FFAs) with bovine and human serum albumin (BSA/HSA). Competition experiments were performed with warfarin and ibuprofen which are considered as stereotypical ligands for drug binding sites 1 and 2, respectively (Ghuman et al., 2005; Krenzel et al., 2013). The STD NMR spectra of caproleic, oleic (Fig. 13) and linolenic acids with BSA/HSA demonstrated extensive overlapping of all protons of the FFAs with protein aminoacid residues. Addition of warfarin at a molar ratio FFA/warfarin $\approx 1/1$, resulted in a significant decrease in the STD signals (Fig. 13B). Similar results were obtained with the addition of ibuprofen (mole ratio FFA/ibuprofen $\approx 1/1$) (Fig. 13C). The STD NMR spectra of α -linolenic acid in the presence of BSA and HSA and in competition experiments with warfarin and ibuprofen showed a minor reduction in the STD amplitude, contrary to the case of caproleic, oleic and linolenic acids. This minor effect, espe-



Fig. 7 STD NMR experiment. Resonances of the protein are selectively saturated (red arrow) and rapidly transferred by spin diffusion throughout the protein. Intermolecular NOE transfer results in a decrease in the signal intensity of the protons of the ligand in close contact with the protein (protons in red). Graphically in the example the H1,1' and H6,6'a resonances are shown. These changes are visual after subtraction of the on– to off-resonance spectrum in the STD spectrum (reprinted with permission of Springer-Verlag, from Marcelo et al., 2012).



Fig. 8 The IL-STD NMR approach: (a) STD NMR with selective irradiation (δ^0) on protein protons; (b) STD NMR with selective irradiation (δ^*) on "reporter ligand" proton γ (supposed to be close to proton C of the adjacent "ligand of interest") as well as on protein protons. The analysis of the IL-STD NMR experiment is focused exclusively on the protons (**A**, **B**, **C**) of the ligand of interest (Monaco et al., 2022).

cially in the case of warfarin, can be interpreted in terms of weak binding affinity of α -linolenic acid to site FA7, which has been characterized as low affinity on the basis of numerous X-ray structural studies (Ghuman et al., 2005; Simard et al., 2005). An alternative interpretation of the minor STD competition effect can be attributed to higher affinity of α -linolenic acid relative to warfarin for the binding site FA7. This is in agreement with the significant reduction by 79 % of the STD NMR signal of warfarin in complexation with HSA upon the addition of warfarin (Fig. 14).

2D INPHARMA competition experiments with proteins with multiple binding sites, as in the case of HSA/BSA, were shown to be very informative. A significant number of negative inter-ligand NOEs were observed between FFAs and ibuprofen upon complexation with HSA/BSA (Fig. 15A). The common inter-NOEs between H2 and H3 of caproleic, oleic, linoleic and α -linolenic acids and H2 of ibuprofen demonstrate a common binding mode of the carboxylate groups of the ligands with HSA/BSA. Inter-NOE connectivities, however, were also observed between the terminal H11,12 of ibuprofen with H2 of α -linolenic acid, H11 of ibuprofen and H2 of oleic and H2,3 of linoleic acids, and H12,13 of ibuprofen with H2 of caproleic acid. The above inter-ligand distances (> 5 Å) are beyond the limits of NOE experiments, under the hypothesis of a single conformational state of FFAs in the binding site FA4. Detailed docking calculations (Morris et al., 2009; Trott and Olson, 2010) confirmed the presence of two anchoring groups of amino acids in FA4 (Table 1). Fig. 16 shows that



Fig. 9 The inter-ligand nuclear Overhasuer effect (ILOE) versus the ILOE for pharmacophore mapping (INPHARMA) experiment. Hp, Hp', H1, H1', H1" and H2, H2' represent protons of the protein (grey), the reference molecule (1, pink) and the fragment (2, green or violet). Arrows represent the magnetization transfer between two protons. Schematic representations of nuclear Overhasuer effect spectroscopy (2D NOESY) spectra are also shown. Black dots represent intramolecular nuclear Overhauser effects (NOEs) and white dots represent intermolecular NOEs (reprinted with permission of Springer, from Cala, 2014).



Fig. 10 The three steps of the NMR tube bioreactor. 1st Step: Prediction of the capacity of natural products to serve as enzyme substrates with 1D STD NMR, 2nd Step: Multiple biotransformation products monitoring through 1D 1 H NMR is exploited of the predicted substrates with immobilized enzymes, 3rd Step: Evaluation of the interaction of the enzymatic products with a pharmaceutical protein target with 1D STD NMR (reprinted with permission of Elsevier B.V., from Chatzikonstantinou et al., 2018).

the two anchoring groups of amino acids orient the carboxylate groups of FFAs in antipodal positions (Alexandri et al., 2022). A significant number of negative inter-ligand NOEs were also observed between caproleic, oleic, linoleic and α linolenic acids and warfarin which demonstrate NOE transfer



Fig. 11 NMR based prediction of isolated compounds to act as enzymatic substrates. A schematic representation of the 1st Step applied in a single compound is shown on the left: Prediction of the capacity of natural products to serve as enzyme substrates through 1D STD NMR. Selected region of STD NMR spectra of **a**, quercetin, **b**, naringin, with free CALB in 65 % PBS in D₂O, 35 % ACN d_3 at 298 K. The reference ¹H NMR spectra are colored in red and the difference ¹H NMR spectra are colored in black. The protons of the putative enzymatic substrates identified to interact with the free enzyme are highlighted in filled blue circle (reprinted with permission of Elsevier B. V., from Chatzikonstantinou et al., 2018).



Fig. 12 Real time multiple biotransformation products monitoring in 2nd Step of the NMR tube bioreactor. Selected region (OH5 protons) of the ¹H NMR spectra of the crude CALB Novozyme 435 mediated biotransformation of a mixture of 5 flavonoids (quercetin (Q), naringenin (N), rutin (R) and luteolin-7-O-glucoside (L), naringin (Ni)) **a**, at 240 h and **b**, at 48 h, in ACN d_3 at 290 K. **c**, The protons of quercetin (Q) and naringenin (N) identified to interact with the free enzyme are marked on the 2D structures by blue circles, the literature reported positions to be biotransformed are labeled in red squares, and the real time CALB Novozyme 435 derived products are labeled with black circles (reprinted with permission of Elsevier B.V., from Chatzikonstantinou et al., 2018).

at the common binding site FA7 of HSA/BSA. Of particular interest are the 2D INPHARMA experiments when α linolenic acid was added in the warfarin - HSA/BSA complex (Fig. 17B) instead of the reverse experiment in which warfarin was added to the α -linolenic acid HSA/BSA complex (Fig. 17A). In Fig. 17B a very significant increase in the magnitude of inter-ligand NOEs was observed which confirms the STD experiments that α -linolenic acid has higher affinity than warfarin at the binding site FA7. Strong NOEs were observed between the aromatic protons of the phenyl butyl and benzopyran ring and the H3 and terminal CH₃ group of α linolenic acid. Since the crystallographic distance of the centers of the two aromatic rings is > 6.9 Å, it was concluded, with the use of docking calculations, the presence of two docking sites (Table 2). This implies the presence of two conformational states of the FFAs at the FA7 binding site (Fig. 18). This conformational flexibility is, very probably, the reason that the location of FFAs could not be determined accurately, despite



Fig. 13 Selected regions of the STD NMR spectra of oleic acid (OA) (2.5 mM): (A) with BSA (25 μ M) in 50 mM PBS buffer in D₂O with 10 % DMSO d_6 ; (B) after the addition of warfarin (W) (2.7 mM) in solution (A); (C) after the addition of ibuprofen (IB) (2.5 mM)) in solution (A) (T = 310 K) (reprinted with permission of Federation of European Biochemical Societies, from Alexandri et al., 2022).

numerous available X-ray structural data (Ghuman et al., 2005; Simard et al., 2005).

Hernychova et al. (2022) investigated the non-covalent vs covalent modes of interaction of 9/10-nitro-oleic acid (NO₂-OA) with HSA. The STD spectrum of oleic acid in the presence of HSA shows a strong signal of the olefinic H9,10 protons (Fig. 19A(b)). In contrast, a very significant reduction of the STD signal of oleic acid was observed which became indistinguishable from the noise (Fig. 19A(c)). This demonstrates that NO₂-OA has a significantly higher affinity to HSA than that of oleic acid. The STD spectrum of warfarin in the presence of HSA shows strong signals of the aromatic protons (Fig. 19B(b)). The STD signal of warfarin bound to HSA upon the addition to the NO₂-OA/HSA complex was significantly reduced (>80 %) (Fig. 19B(c)) which shows the primary role of non-covalent competitive binding mode. The STD spectrum of ibuprofen in the presence of HSA shows strong signals of the aromatic protons (Fig. 19B(b)). The STD amplitude of ibuprofen upon the addition to the NO₂-OA/HSA shows a minor reduction (Fig. 19C(c)), which demonstrates that NO₂-OA does not have a higher affinity for HSA than that of ibuprofen. 2D-INPHARMA experiment demonstrated strong inter-ligand NOE connectivities between the aromatic protons of ibuprofen and the olefinic H2,8,11 and H3 of NO₂-OA. Both ligands, therefore, share a common binding site (<4.5 Å) and, thus, are competitive rather than allosteric, towards binding site FA4.

The structural basis of artemisinin binding sites in serum albumin was investigated with the combined use of NMR and docking calculations (Primikyri et al. 2022). Fig. 20 shows efficient binding of artemisinin to BSA since STD amplification factors (A_{STD}) of all protons are above 60 %. Competition experiments were also performed with warfarin and ibuprofen. After the addition of equimolar concentration of warfarin in the complex of artemisinin with BSA/HSA, the resulting STD signal intensities (warfarin/artemisinin 3/1)



Fig. 14 STD NMR spectra of: (A) warfarin (W) (2.5 mM) with HSA (25 μ M) in 50 mM PBS buffer in D₂O with 10 % DMSO *d*₆; (B) warfarin (W) (2.5 mM) after its addition in the α -linolenic acid (ALA) (3.2 mM)/HSA (25 μ M) complex in 50 mM PBS buffer in D₂O with 10 % DMSO *d*₆, T = 310 K (reprinted with permission of Federation of European Biochemical Societies, from Alexandri et al., 2022).



Fig. 15 Selected regions of inter-ligand 2D Tr-NOESY NMR spectra of linoleic acid (LA) (2.5 mM) with BSA (25 μ M) in 50 mM PBS buffer in D₂O with 10 % DMSO *d*₆: (A) after the addition of ibuprofen (IB) (3 mM). (B) After the addition of warfarin (W) (3 mM) (mixing time = 300 ms, T = 310 K). The red cross-peaks denote inter-ligand NOE connectivities (reprinted with permission of Federation of European Biochemical Societies, from Alexandri et al., 2022).

Table 1 Electrostatic and hydrogen bond interactions between the carboxylate groups of caproleic acid (CA), oleic acid (OA), linoleic acid (LA), α -linolenic acid (ALA) and ibuprofen (IB) with the amino acids of the binding site 4 of HSA, the poses that giving rise to interactions with amino acids and affinities in kcal/mol (reprinted with permission of Federation of European Biochemical Societies, from Alexandri et al., 2022).

Ligand	R410		Y411			S419		T422		
	Group	Distance (Å)	Group	Distance (Å)	Pose/affinity (kcal/mol)	Group	Distance (Å)	Group	Distance (Å)	Pose/affinity (kcal/mol)
	Anchor si	te 1				Anchor	site 2			
CA	$NH_2 \eta^2$	3.4	OH	2.2	1/-5.5	OH	5.2	OH	3.6	6/-5.3
OA	$NH_2 \eta^2$	2.4	OH	2.1	1/-6.8	OH	4.4	OH	3.2	5/-6.6
LA	$NH_2 \eta^2$	2.4	OH	1.8	2/-7.2	OH	4.3	OH	3.1	7/-7.1
ALA	$NH_2 \eta^2$	2.4	OH	2.0	8/-7.2	OH	3.8	OH	3.0	6/-7.3
IB	$NH_2 \eta^2$	2.9	OH	2.0	2/-7.3		-		_	



a. Ibuprofen

b. Superposition

Fig. 16 Poses with best scores for binding site 4 of HSA with: **a.** ibuprofen and **b.** superposition of caproleic, oleic, linoleic and α -linolenic acids and ibuprofen (adopted from Alexandri et al., 2022).

demonstrated a stronger STD effect of warfarin which implies a higher affinity of warfarin relative to artemisinin. Similar results were also obtained with competition experiments with ibuprofen. 2D INPHARMA experiments revealed significant inter-ligand NOE connectivities between the aromatic protons of warfarin and several protons of artemisinin (Fig. 21). Thus, 14-, 13- and 15-CH₃ groups of artemisinin show strong and strong-to-medium NOEs with the benzoyl group of warfarin. Site specific docking simulations (pose number 2 of Fig. 22) are in excellent agreement with the experimental inter-ligand NOEs. Similarly, strong inter-ligand NOEs were observed between the aromatic protons of ibuprofen with 14-, 13- and 15-CH₃ groups of artemisinin, in excellent agreement with site-specific docking calculations. The significant superposition of warfarin, which is in the anionic form at pH \approx 7.4, with artemisinin, which is highly hydrophobic, emphasizes the extraordinary ligand binding properties of HSA (Fasano et al. 2005).

In the case of ligands that bind simultaneously to adjacent protein pockets (Fig. 9), the inter-ligand NOEs (ILOEs) may require significantly longer mixing times (600–800 ms) for a sufficient S/N ratio. This often leads to the dilemma of whether or not the intensities of the NOEs reflect the true inter-NOEs or spin-diffusion process or both. Sledz et al. (2010) performed a careful optimization of inter-ligand NOEs to inhibitory discovery against *Mycobacterium tuberculosis* pantothenate synthetase (PtS). For highly hydrophobic inhibitors negative inter-NOEs were observed, even in the case of perdeuterated protein (d PtS). This was attributed to high concentrations of hydrophobic and isoluble inhibitors that give rise to nonspecific interactions.

Ligand-observed NMR techniques have also been applied in extracts of natural products. STD NMR, Tr-NOESY and STD-TOCSY experiments were utilized to investigate the binding potential of the ethyl acetate extract of *Stryphnodendron polyphyllum* with human serum albumin (HSA) (Tanoli et al., 2015). However, a hyphenated system comprising LC-SPE NMR was utilized to facilitate the assignment of the complex ¹H NMR spectra. STD NMR was utilized to investigate the interaction of a diethyl ether extract of Artemisia annua with bovine serum albumin (Primikyri et al., 2022). Artemisinin was shown to be the principal analyte involved in the interaction. Further STD experiments with selective irradiation of the characteristic singlet H5 resonance ($\delta = 6.26$ ppm) of artemisinin facilitated the identification of discrete STD signals of artemisinin even in overcrowded regions of the spectrum (2.5– 0.9 ppm).

From the examples shown above it can be concluded that: (i) the STD NMR and its variants, due to high sensitivity, can be very useful as a preliminary step for ligand screening prior to the application of the more demanding INPHARMA NMR. Further improvement of the STD method includes the investigation of ligand structures, within the protein binding site, with the use of complete relaxation and conformation exchange matrix (CORCEMA) calculations which were applied for the screening of carbohydrates and peptides (Javalakshmi and Rama Krishna, 2004; Maity et al., 2019). (ii) In the case of extracts of natural products, the use of multiple on-resonance saturation frequencies in less crowded spectral regions (Monaco et al., 2017; Watt et al., 2018; Monaco et al., 2020) could facilitate the interpretation of the results, without the need of hyphenated LC-SPE NMR techniques. (iii) The 2D INPHARMA experiments, in combination with docking and/or molecular dynamics simulations, can be successfully applied in investigating competitive binding in natural product-protein interactions, even in cases of proteins with multiple binding sites.

4. In-cell NMR of protein-natural products interactions

4.1. In-cell enzymatic biotransformations

Enzymes are the targets of many natural products and drugs, therefore, NMR can be used to investigate their simulation or inhibition in cellular environments (Siegel and Selenko, 2019) by monitoring biotransformed products. In-cell enzymatic activity was reported for the antibiotics for meropenem and



Fig. 17 Selected regions of inter-ligand 2D Tr-NOESY NMR spectra of: (A) α -linolenic acid (ALA) (2.5 mM) with HSA (25 μ M) in 50 mM PBS buffer in D₂O with 10 % DMSO *d*₆ after the addition of warfarin (W) (2.5 mM). (B) warfarin (W) (2.5 mM) with HSA (20 μ M) in 50 mM PBS buffer in D₂O with 10 % DMSO *d*₆ after the addition of α -linolenic acid (ALA) (2.5 mM). The red cross-peaks denote inter-ligand NOE connectivities (reprinted with permission of Federation of European Biochemical Societies, from Alexandri et al., 2022).

imipenem which can be hydrolyzed by the new Delhi metallo- β -lactamase subclass 1 (NDM-1) produced by antibiotic resistant bacterial strain (Ma et al., 2014). Time resolved ¹H NMR spectra of cell suspension of E.coli expressing the β -lactamase NDM-1, showed clearly distinguished resonances of the hydrolysis products. The same method was used for the screening of several drug candidates in a 96-well plate containing E.coli cells (Ma et al., 2015).

 19 F has found several applications in fragment-based drug discovery since ~ 25 % of the approved drugs contain fluorine atoms, 19 F is a spin ø nucleus with 100 % natural abundance, sensitivity of 83 % relative to that of ¹H and a chemical shift range of several hundred ppm (Norton et al., 2016). In-cell enzymatic hydrolysis of a fluorinated anandamide analog catalyzed by human fatty acid amide hydrolase, overexpressed in HEK 293 cells, was followed by real-time ¹⁹F NMR (Veronesi

et al., 2016). The fluorinated substrate and the fluorinated product showed significantly different chemical shifts. Real-time ¹⁹F NMR was used to investigate the phosphorylation of kemptide containing (2S, 4R)-perfluoro-*tert*-butyl-Hyp by the protein kinases pkA activity in HeLA cell extracts (Tressler et al., 2020). Drug related cellular ¹⁹F NMR studies, therefore, may proved particularly promising (Buchholz et al., 2021).

4.2. Protein-natural products interactions

NMR spectroscopy is a versatile tool for investigating biomolecular structures in a breadth of cellular systems from prokaryotic to eukaryotic cells. Readers can consult recent publications for comprehensive and critical discussion on sample preparation, isotopic labeling, NMR techniques and a wide range of applications (Banci et al., 2013; Hamantsu et al.,

igand	K199			R218			R222			H242			R257		
	Anchor site 1									Anchor sit	te 2				
	Group	Dist. (Å)	Pose / affinity	Group	Dist. (Å)	Pose / affinity	Group	Dist. (Å)	Pose / affinity	Group	Dist. (Å)	Pose / affinity	Group	Dist. (Å)	Pose / affinity
		~	(kcal/mol)		~	(kcal/mol)		~	(kcal/mol)		~	(kcal/mol)		~	(kcal/mol)
CA							-3HN	2.5	2/-5.2				-3HN	3.0	1/-5.3
AC				$NH_2 \eta^1$	3.2	9/-5.6	NHε	2.5	1/-6.0	NHt	2.6	3/-5.8	NH2 η ¹	2.8	7/-5.7
Y				$NH_2 \eta^1$	3.0	7/-5.9	NHε	2.4	2/-6.2	NHτ	2.4	6/-6.0	NHε	2.8	1/-6.2
ALA				$NH_2 \eta^2$	2.3	1/-7.1				NHτ	3.3	4/-7.0	NH2 η ¹	3.5	4/-7.0
N	O(4) NH ⁺ ₃	2.6	7/-7.5	NH, η ^{1,2} -	2.2	7/-7.5	NH, η ¹ -	2.5	4/-7.7	C∥0	2.3	4/-7.7			

ring- $H\epsilon^2$

0

C(11)

0

C(11) =

icantly lower preparation costs of the label-free samples. Protein-ligand interactions can be investigated in living cells

with the saturation transfer double difference (STDD) method, which involves a second STD experiment which is performed with the same sample, but in the absence of the ligand to remove unwanted STD signals due to the cellular matrix (Fig. 23) (Claasen et al., 2005). Due to high sensitivity of the STD technique, very good quality spectra were obtained in < 1 h. The technique was used to investigate the binding of the highly potent ($K_D = 5 \mu M$) cyclic pentapeptide cyclo (RGDfV) to integrin a11bβ3 which is the most abundant glycoprotein of intact blood platelets. The significant 5-fold increase of the STD amplitude with integrin a11b₃ in native platelets than in liposomes emphasizes the importance of

2013; Freedberg and Selenko, 2014; Siegal and Selenko, 2019; Nishida et al., 2020; Theillet and Luchinat, 2022; Luchinat and

Banchi, 2022; Luchinat et al., 2022; Theillet, 2022). In this Review we focus only to ligand-observed cellular NMR since it can provide fast analysis using mainly ¹H NMR, with signif-

investigating interactions of membrane proteins in their natural environment. Although both systems show similar STD effects, Arg4 δ , δ' and GlyH α showed significantly different STD amplitudes, presumably due to slightly different binding modes. The STDD method was also used to investigate the interaction of the dendritic-cell specific ICAM-3 grabbing non-integrin (DC-SIGN) receptor with Saccharomyces cerevisiae mannan (Marie et al., 2005) and to screen marine natural products against cannabinoid G-protein coupled receptors (Pereira et al., 2009).

Potenza et al. (2011) investigated the interaction of two cyclic mimetics of the Arg-Gly-Asp motif with ECV304 bladder cancer cells in which integrin $av\beta 3$ is highly expressed. STD experiments were used to identify the protons of the ligands in closest contact with the protein, and Tr-NOESY to define the preferred conformation of the bound ligands. Complementary use of docking calculations showed that the two peptides, which differ in the configuration of two carbons, exhibit different modes of interaction with the protein.

Mari et al. (2010), investigated the binding of various cyclopeptides containing the RGD and NGR motifs onto two human cancer cell lines, including a non-small cell lung carcinoma (MR300) and a melanoma (MSR3) cell line, which display different phenotypes for CD13 and $a_v\beta_3$. Both cell lines express $av\beta 3$ but differ in the expression of CD13; the MR300 cell express CD13(av β 3⁺ CD13⁺ cells) whereas MSR3 cells are negative ($av\beta 3^+$ CD13⁻ cells). Literature structural and biochemical data showed that the RGD and iso DGR motifs can effectively bind (low μ M affinities) to av β 3, unlike the NGR peptide which interacts with CD13 on tumor vessels, thus, indicating that NGR and RGD/isoDGR are separate moieties binding to different receptors. In the presence of av β 3sh CD13⁻ cells in which efficient silencing (>70 %) of avβ3 integrin was achieved, the CRGDC and CisoDGRC resulted in positive NOE effects (Fig. 24). It was concluded that in experiments using living cells, the change in sign of the NOE cross-peaks is determined primarily by the ligandprotein interactions rather than due to changes in medium viscosity.

The binding of cyclic RGD peptidomimetic to a_5B_1 integrin, overexpressed in breast cancer cells, was investigated with the combined use of NMR (STD and 2D Tr-NOESY) and docking calculations (Guzzetti et al., 2017). The ligand with

1.41

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Fig. 18 Poses with best scores for binding site 7 of HSA with: **a.** warfarin and **b.** superposition of caproleic, linoleic and α -linolenic acids; for α -linolenic acid, spatial deviation is observed with respect to the rest of the FFAs. (adopted from Alexandri et al., 2022).



Fig. 19 Selective regions of ¹H NMR spectra (500 MHz) of: A(a) oleic acid (OA) (1.25 mM) with native HSA (25 μ M). (b) STD NMR spectrum of (a). (c) STD NMR spectrum of oleic acid (1.25 mM) after addition to the NO₂-OA (1.25 mM)/HSA (25 μ M) complex. B(a). warfarin (W) (1.25 mM) with native HSA (25 μ M). (b) STD NMR spectrum of (a). (c) STD NMR spectrum of warfarin (1.25 mM) after addition to the NO₂-OA (1.25 mM)/HSA (25 μ M). (b) STD NMR spectrum of (a). (c) STD NMR spectrum of warfarin (1.25 mM) after addition to the NO₂-OA (1.25 mM)/HSA (25 μ M) complex. C(a) ibuprofen (IB) (1.25 mM) with native HSA (20 μ M). (b) STD NMR spectrum of (a). (c) STD NMR spectrum of ibuprofen (1.25 mM) after addition to the NO₂-OA (1.25 mM)/HSA (25 μ M) complex. C(a) ibuprofen (IB) (1.25 mM) with native HSA (20 μ M). (b) STD NMR spectrum of (a). (c) STD NMR spectrum of ibuprofen (1.25 mM) after addition to the NO₂-OA (1.25 mM)/HSA (25 μ M) complex. C(a) ibuprofen (IB) (1.25 mM) with native HSA (20 μ M). (b) STD NMR spectrum of (a). (c) STD NMR spectrum of ibuprofen (1.25 mM) after addition to the NO₂-OA (1.25 mM)/HSA (25 μ M) complex (reprinted with permission of Elsevier B.V., from Hernychova et al., 2022).

the larger number of STD signals showed the highest potency with nMI_{50} value. The binding of an antituberculosisa nonpathogenic bacterial system was investigated by NMR (Bouvier et al., 2019). The variable intensities of the experimental STD signals of the ligand were compared with the computational values for a set of conformations for a model building of the hit-target interaction at atomic resolution.

Primikyri et al. (2018) reported a combined STD and 2D-NOESY experiment to monitor the binding of natural products and synthetic analogues to the anti-apoptotic Bcl-2 protein (Primikyri et al., 2014) inside living human T-leukemic cells. Experiments were performed with quercetin and a quercetin-alanine bioconjugate. Quercetin uptake in jurkat cells was shown to be very rapid and effective (Fiorani et al., 2010). The quercetin-alanine bioconjugate showed 2-bold increased permeability compared to quercetin in model cell line (Kim et al., 2009; Kellici et al., 2017). The STD spectrum shows that all protons of 3'-quercetin-alanine were involved in interactions with intracellular receptors (Fig. 25A). Addition of the inhibitor HA14-1, which binds selectively to the BH3 pocket of Bcl-2 with $IC_{50} = 9 \mu M$ (Wang et al., 2000; Manero et al., 2006) involved in interactions with intracellular receptors (Fig. 25A) shows a significant reduction of the STD signal intensities of the quercetin-amino acid hybrid by a factor of ~ 60 %. This result shows that the selective inhibitor HA14-1 competes favorably the hybrid molecule to the BH3 domain of Bcl-2. Further confirmation of this interaction was obtained when a similar STD experiment was performed in Jurkat Puro cells which do not overexpress the Bcl-2 protein. In this case the STD signal intensities of the hybrid mole-



Fig. 20 (A) ¹H NMR of 2 mM artemisinin in PBS, pH 7.4, D₂O with 10 % DMSO d_6 . (B) ¹H NMR of 2 mM artemisinin with 20 μ M BSA in PBS, pH 7.4, D₂O with 10 % DMSO d_6 . (C) STD NMR of 2 mM solution (B) (Primikyri et al., 2022).



Fig. 21 Selective region of 2D Tr-NOESY NMR spectrum of 2 mM artemisinin and 20 μ M BSA after the addition of 2 mM warfarin in PBS buffer solution in D₂O, pD 7.4 with 10 % DMSO *d*₆. (A) Red cross-peaks correspond to inter-NOEs between warfarin and artemisinin and (B) blue cross-peaks correspond to intra-NOEs of artemisinin, mixing time = 300 ms (Primikyri et al., 2022).



Fig. 22 Pose number 2 of warfarin and artemisinin for binding site FA7 of HSA (1BM0.pdb) (Primikyri et al., 2022).



Fig. 23 Schematic overview of the Saturation Transfer Double Difference (STDD) NMR method to detect binding of ligands (denoted by purple dots) to membrane-bound proteins in living cells (denoted by red dots). A cell suspension is split up into two NMR tubes. Sample A contains also the added ligands. Sample B contains only the cell suspension. Top: STD NMR spectrum of ligand and cells containing the transmembrane receptor. The spectrum contains the STD signals from the added ligand and the other binding processes in the cell. Middle: STD NMR spectrum of cells containing the transmembrane receptor. The STD NMR spectrum contains all signals from binding processes within the cell. No ligand receptor interactions can occur. The STDD spectrum (bottom) is obtained by subtracting the cell STD spectrum (middle) from the cell/ligand STD spectrum (top) (reprinted with permission of the American Chemical Society, from Claasen et al., 2005).

cule were reduced by 35 % compared to the STD intensities in jurkat cells. Primikyri et al. (2018), furthermore, investigated conformational changes of 3' quercetin-alanine upon binding to Bcl-2 at a cellular level. Strong negative Tr-NOEs, between the aromatic protons H5'– H6', H2'– H5' and H2'– H8 and

between the methyl and H α protons of the alanine residue were observed. It is worth noting that H2'–H5' and H2'–H8 crosspeaks were not present in the spectrum of the conjugated molecule in buffer solution. 2D Tr-NOESY experiments, therefore, are very effective in investigating the bound conformation of



Fig. 24 A) Tr-NOESY spectrum (mixing time = 100 ms) of CRGDC in the presence of $\alpha\nu\beta3^+$ CD13⁺ cells: the crosspeaks deriving from correlations of the arginine γ/δ protons of the ligand are negative (blue), with the same sign as the diagonal. The flipped sign in NOE cross-peaks indicates that CRGDC interacts with a cell surface receptor. b) Tr-NOESY spectrum (mixing time = 600 ms) of CRGDC in the presence of $\beta3$ -silenced ($\alpha\nu\beta3$ shCD13⁻) cells: the cross-peaks (red) deriving from correlations of the arginine γ/β and γ/δ protons of the ligand have opposite phase with respect to the diagonal, indicating that the molecule is free in solution. c) As expected, CRGDC binds to its receptor also in mock transduced cells (Tr-NOESY control experiment) (reprinted with permission of Wiley-VCH, from Mari et al., 2010).

natural products in their native cellular environment. Spectral acquisition parameters, however, should ensure cell viability (\sim 2h) throughout the Tr-NOESY experiment. Of particular interest are also similar experiments with taxifolin. The STD spectrum shows that all protons of taxifolin are involved in intracellular interactions. Addition of the selective inhibitor HA4-1 did not affect the STD amplitude of taxifolin which demonstrated that this natural product does not interact with Bcl-2 at the cellular level.

4.3. Bioreactors for real-time in-cell NMR

The sensitivity problems associated with in-cell NMR necessitate the need of high cell densities in the NMR tube which result in fast depletion of oxygen, of cellular nutrients, intracellular pools of ATP, glucose and NADPH. This may affect structure-function of proteins and increase of cell apoptosis within 1 to 2 h (Siegal and Selenko, 2019; Luchinat et al., 2022). To overcome the problem of low cell viability and maintain a stable metabolic state of cells for several hours or even days, flow-probe bioreactors were developed for investigating cellular metabolism (Freyer et al., 1990; Gillies et al., 1993). Emphasis has been given to the design of bioreactors for narrow-bore (5 mm) magnets (Kubo et al., 2013; Breindel et al., 2018; Cerofolini et al., 2019; Luchinat et al., 2020). Using a commercially available sealed flow unit, a 90 % cell viability and metabolic activity up to 72 h was achieved for HEK 293 T cells encapsulated in agarose hydrogels ($\sim 3 \times 10^7$ cells) while a nutrient flow was maintained with the use of an FPLC pumb (Luchinat et al., 2020). This bioreactor set up allowed the investigation of the binding of two inhibitors (acetazolamide and methazolamide) to human carbonic anhydrase (CA2) using real-time 1D ¹H NMR spectra. Timedependent binding curves were interpreted in terms of different cell membrane permeability of the two inhibitors. Although further research is needed to understand the effect of different hydrogels on cell phenotype (Luchinat et al., 2020; Mateos et al., 2020), the use of bioreactors for real-time in-cell NMR has a promising future.

5. Summary and outlook

In-tube NMR monitoring is an established method for obtaining information about catalyzed reactions of immobilized enzymes, investigation of the capacity of natural products to serve as enzyme substrates and an excellent tool for studies of interactions of biotransformed products with protein targets. Investigation of biocatalyzed reactions with the use of immobilized microbes or cell suspensions is also a fruitful future research area. The NMR methods of investigating enzymatic biotransformations, of extracellular (Tomaselli et al., 2023) and intracellular metabolites can be complemented with comprehensive computational tools for small molecule metabolism prediction and identification (Djoumbou-Feunang et al., 2019).

The ligand-observed STD and INPHARMA/ILOE NMR techniques, when used in combination, were shown to be of broad applicability since they are: (i) not limited by the protein molecular weight, (ii) can be utilized for multiple natural product binding screening and (iii) are capable for investigating atomic level bound conformation (in conjugation with computations), provided that a reference bound molecule of known structure is available.

Ligand-observed STD and 2D NOESY in cell NMR experiments were shown to be a fruitful approach for protein–ligand interactions in the field of natural products since they utilize label-free samples, they can provide fast analysis, and are less constrained in terms of types of cells and proteintarget expression compared to protein-observed in-cell NMR methods with selectively labeled proteins. The problem of cell viability can be alleviated with the use of bioreactors for



Fig. 25 STD 500 MHz in-cell NMR spectra of (A) 3' quercetin-alanine (purple color annotation) (1.4 mm) within Jurkat Bcl-2 cells and (B) 3' quercetin-alanine (1.4 mm) within Jurkat Bcl-2 cells in the presence of the selective inhibitor HA14-1 (gray color annotation) (0.2 mm). Residual signals from the cells appear at 0.97 and 1.35 ppm annotated with asterisks. The multiplet at 1.4 ppm annotated with an asterisk is attributed to alanine and *N*-carboxy alanine due to hydrolysis of the quercetin conjugate (reprinted with permission of Federation of European Biochemical Societies, from Primikyri et al., 2018).

real-time in-cell NMR which is a promising field for further investigation. Contrary to protein-observed approaches, however, information of the protein-target is not specifically assessed, unless competition experiments with proteinspecific inhibitors at a cellular level and protein overexpression can be achieved.

The above ligand-observed methods are not limited to protein–ligand interactions, since they have been successfully applied to DNA-ligand interaction even at cellular level (Krafcikova et al., 2019). In the long term it would be expected that the ligand-observed potentialities will be further expanded with ultra-high field instrumentation equipped with cryoprobes.

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