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Microscale Thermophoresis Analysis of Membrane Proteins

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Authors' contributions

This work was carried out in collaboration among all authors. All authors read and approved the final manuscript.

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Review Article

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ABSTRACT

Microscale thermophoresis (MST) is an analytical technique for measuring biomolecular interactions. It is based on the physical phenomenon that particles move within temperature gradients, which is affected by their size, charge, hydration shell and conformation. The MST sample must contain a fluorescent target molecule used to observe the movement of particles, and this can be titrated with an unlabelled binding partner for quantifying the interaction. MST is highly sensitive, using relatively small amounts of sample, and it has no limitations on the size of the target biomolecule, on the affinity of the interaction or on the composition of the buffer and other sample components. This makes MST ideally suited to characterising interactions with membrane

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proteins, which can be studied in cell lysates, native membranes, solubilised in detergents or reconstituted in lipids. The intrinsic aromatic residues of membrane proteins have been used as the fluorophore for MST (label-free MST) or membrane proteins have been labelled with a range of fluorescent dyes or conjugated with fluorescent proteins (labelled MST). The different types of membrane proteins that have had biomolecular interactions characterised by MST include the SARS-CoV-2 spike protein, GPCRs and other receptors, sensor kinases, ion channels, aquaporins, and transport proteins.

Keywords: Biomolecular interactions; fluorescent labelling; ligand binding; drug screening; SARS-CoV-2 spike protein; GPCRs; receptors; ion channels; aquaporins; transport proteins.

1. INTRODUCTION

(MST) Microscale thermophoresis is technique biophysical for measuring а biomolecular interactions. It is based on the physical phenomenon that particles move within temperature gradients, usually from regions of higher to lower temperature. The movement of particles is affected by their size, charge, hydration shell and conformation, any of which can change during biomolecular interactions [1-14]. In MST a microscopic temperature gradient is induced by infrared (IR) laser light and the sample must contain a fluorescent target molecule that is used to observe the movement of particles. The fluorescent molecule is kept at a constant concentration and is titrated with a range of concentrations of an unlabelled binding partner. The movement of fluorescent molecules within the temperature gradient results in quantifiable change their а in local concentration and therefore of the measured fluorescence, thus enabling estimation of binding affinities and kinetic parameters [15-18]. The necessary fluorescence property may be intrinsic to one of the binding partners (e.g., from aromatic residues in a protein) (label-free fluorescent MST) or а dye or other fluorescent protein (e.g., green fluorescent protein, GFP) must be attached to one of the binding partners (labelled MST). MST can of measure many types biomolecular interactions, including protein-protein, proteinnucleic acid. protein-lipid, protein-small molecule/peptide/ion or protein-liposome/vesicle interactions. can also measure lt conformation changes biomolecule in а that is subjected to varying conditions. In addition to binding affinities and kinetic parameters. MST can be used to assess other physical parameters of biomolecules and their interactions such as aggregation and precipitation, stoichiometry and oligomerisation.

2. THE MST EXPERIMENT

In the MST instrument (Fig. 1A), samples are measured in fine glass capillaries with a typical total volume of 4 μ l. The capillary contains a solution of a fluorescent target molecule and a binding partner. The fluorescent molecule is excited using an appropriate wavelength of light and the emitted fluorescence is detected, both through the same objective lens. An IR laser is focused into the capillary to create a microscopic temperature gradient at the exact spot where fluorescence emission is detected. This gradient is focused on a diameter of around 50 μ m and typically contains a temperature difference of 2-6 °C.

The MST experiment (Fig. 1B) begins with the IR laser switched off, where molecules are homogenously distributed and diffuse freely within the sample. At this point the initial fluorescence intensity is detected. When the IR laser is switched on there is immediate heating of the focused area resulting in a rapid change in fluorophore properties and a strong decrease in fluorescence intensity before thermophoresis begins. This is followed by thermophoretic movement of the fluorescent molecules out of the heated area resulting in a slow decrease in fluorescence intensity. A steady state is typically reached after around 30 seconds. The IR laser is then turned off resulting in an immediate increase in fluorescence intensity. As the sample cools down there is movement of fluorescent molecules back into the area that was heated to give a further increase in fluorescence intensity. For each sample, the normalised fluorescence (F_{norm}) is calculated from the initial fluorescence (F_0) and from the fluorescence after thermophoresis (*F*₁), as follows: $F_{norm} = F_1/F_0$. The change in the normalised fluorescence against the change in concentration binding partner can be used of to quantify the affinity of the binding interaction.





In the MST instrument (**A**) a series of sixteen glass capillaries (volume 4 µl) are filled with samples containing a constant concentration of a fluorescent target biomolecule and a range of concentrations of a binding partner (e.g. a ligand). The samples are scanned in turn by being subjected to heating at a microscopic area (50 µm diameter) using an IR laser, which creates a temperature gradient. Fluorescence is measured at the same area to follow movement of the target biomolecules. In the profile of the MST experiment (**B**) the initial fluorescence is measured then the IR laser is turned on (5 seconds). This induces an immediate temperature jump and then movement of the target biomolecule away from the heated area (thermophoresis) takes place until a steady state is reached (~30 seconds). The IR laser is turned off (35 seconds) then there is back diffusion of the target biomolecule. The magnitude of the thermophoresis, and therefore the normalised fluorescence intensity, are altered by different concentrations of the ligand

3. ADVANTAGES OF MST

MST is a relatively simple, robust, and rapid technique that has several advantages over other biophysical techniques commonly used to measure biomolecular interactions such as surface plasmon resonance (SPR) [19-23], isothermal titration calorimetry (ITC) [24-30], fluorescence spectroscopy [31, 32], circular dichroism (CD) spectroscopy [33-36], solutionand solid-state nuclear magnetic resonance (NMR) spectroscopy [37-50], and mass spectrometry (MS) [51-61]. MST has no limitations on the size of the target biomolecule or on the affinity of the interaction to be measured (pM to mM) or on the composition of the buffer and other sample components. The sample may contain detergents or lipids and MST measurements can be performed on complex samples such as cell lysates or membrane preparations. Unlike in SPR, the target biomolecule does not need to be immobilised. MST is highly sensitive, so a principal advantage is that experiments use relatively small amounts of sample. For example, a full titration using sixteen capillaries each containing 4 µl and performed in triplicate would use a total volume of 192 µl. This would contain a total of 1.92-19.20 picomoles of fluorescent biomolecule if at a concentration of 10-100 nM. It follows that assay optimisation also has low sample consumption. MST measurements in the instrument are relatively guick, taking around 40 seconds per sample/titration point, so a full titration with a series of sixteen dilutions can be run in under 15 minutes. These advantages mean that MST is particularly well suited to studying membrane proteins [62-64] that are often large and must be kept in a membrane, lipid or detergent environment to retain their native structure and activity, and some, especially eukaryotic proteins, can only be obtained in small quantities.

4. MST ANALYSIS OF MEMBRANE PROTEINS

When manipulating a membrane protein with a fluorophore for MST measurements, any potential effects of the fluorophore on the native structure and activity of the protein should be considered and tested for. This should include the use of appropriate controls in the MST measurements and may require the use of other biophysical and biochemical analyses to test structural integrity and activity. Such effects can

be avoided if native aromatic residues in a target membrane protein can be used as the fluorophore for MST measurements, but only four of the studies on membrane proteins (4/60) employed this approach (Table S1). On the face of it use of native aromatic residues is more straightforward than reacting the target membrane protein with a fluorescent dye or conjugating it with a fluorescent protein, but the intensity of intrinsic fluorescence produced in proteins most membrane studied was presumably not high enough for efficient detection.

One strategy that avoids manipulating the target membrane protein with a fluorophore is to reconstitute it in nanodiscs that have themselves been reacted with a fluorescent dye. For example, MST measurements were performed on the human neurotensin receptor NTS1 reconstituted in nanodiscs formed using fluorescently labelled membrane scaffold protein MSP1D1. MST measured binding of the Gprotein subunit Gαi1 to NTS1 in Alexa Fluor™ 647-labelled MSP1D1 nanodiscs formed using different lipids and in the presence of different NTS1 ligands. The affinity of Gai1 binding to NTS1 was influenced by the lipid composition of the nanodiscs, where the highest affinities were obtained using porcine brain polar lipid (BPL) in the absence of ligand ($K_D = 300 \pm 100$ nM) and in the presence of agonist neurotensin ($K_D = 140 \pm$ 60 nM). Empty nanodiscs (no NTS1) did have a similar binding affinity in the presence of neurotensin (K_D = 200 ± 100 nM). For comparison, affinities in the presence of antagonists SR48692 or SR142948A were 600 ± 300 nM and 300 ± 100 nM, respectively, and in the presence of a non-hydrolysable analogue of GTP (GTPvS) (negative control) the affinity was 1.5 ± 0.8 µM [65].

5. FLUOROPHORES USED IN MST MEASUREMENTS ON MEMBRANE PROTEINS

Out of the 60 different studies that have used MST to analyse membrane proteins (Table S1) over a half (52.5%) have employed commercial kits designed to be used with Monolith MST instruments. The majority of these kits were red (17/60) or blue (4/60) dyes containing a succinimidyl ester group that reacts with the primary amines on lysine residues to form a covalent bond. Some the of kits (8/60) were red dyes that react with His-tags engineered on to the target biomolecule, which can be used with

either purified proteins or crude samples (e.g. cell lysates). A few of the kits (2/60) were green dyes containing a maleimide reactive fluorophore that reacts with cysteine residues to form a covalent bond. All of these kits are generally optimised for proteins with a molecular weight of more than 5 kDa and concentrations of 2-20 µM. The next most common type of fluorophore used with membrane proteins were three Alexa Fluor[™] dyes (488, 546, 647) (7/60) (Figure 2). Alexa Fluor[™] 488 (1) is a bright green dye with excitation suited to the 488 nm laser line. Alexa Fluor[™] 546 (2) is a bright orange dye that can be excited using 488 nm or 532 nm laser lines. Alexa Fluor[™] 647 (3) is a bright far-red dye with excitation suited to the 633 nm laser line, it contains a succinimidyl ester group that can react with the primary amines of lysine residues. In some studies (4/60) the target membrane protein was conjugated to GFP, which can be excited by the 488 nm laser line. GFP from Aeguorea victoria (water jellyfish) is comprised of

238 amino acids (26.9 kDa) (UniProt P42212) and has a B-barrel structure with eleven Bstrands [66,67]. The chromophore of GFP of the three amino acids Serconsists dehydroTyr-Gly (residues 65-67), which have been mutated (F64LT) to create enhanced GFP (eGFP) that has increased fluorescence intensity, greater photostability and higher efficiency compared to wild-type [68,69]. Three of the studies (3/60) used the dye Cy5 (1,1'dimethyl-3,3,3',3'-tetramethylindocarbocyanine) (4) as fluorophore (Figure 2), which is a far-red fluorescent dye with excitation suited to the 633 nm or 647 nm laser lines. Cy5 contains an amine group that can be reacted with activated esters and other electrophilic reagents. One study (1/60) used the zwitterionic red dye Atto-647 (5) as fluorophore (Fig. 2), for which suitable excitation sources are next to the He:Ne laser (633 nm), the 647 nm line of the Krypton-Ion laser or a diode-laser emitting at 650 nm.



Fig. 2. Chemical structures of some fluorophores used in MST measurements on membrane proteins

Alexa Fluor[™] 488 (1), Alexa Fluor[™] 546 (2), Alexa Fluor[™] 647 (3), Cy5 (4), and Atto-647 (5)

6. MEMBRANE PROTEINS ANALYSED BY MST

The different types of membrane proteins that have had biomolecular interactions characterised by MST include the severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) spike protein, GPCRs and other receptors, sensor kinases, ion channels, aquaporins, transport proteins, and others.

6.1 SARS-CoV-2 Spike Protein

In recent years eleven studies have employed MST to analyse various interactions with the SARS-CoV-2 spike protein, which binds to the angiotensin-converting enzyme (ACE2) 2 receptor on target human cells. MST was used to measure the binding of bacterial (Escherichia lipopolysaccharide the coli) to full-lenath (residues 16 to 1213) fluorescently-labelled SARS-CoV-2 spike protein, giving a K_D of 46.7 ± 19.7 nM [70]. Various techniques were used to investigate the molecular mechanism of how the SARS-CoV-2 spike protein augments lipopolysaccharide-mediated hyperinflammation, spike protein serves where the as а lipopolysaccharide delivery system to its receptors. This included use of MST to measure the binding affinity of lipopolysaccharide to the SARS-CoV-2 spike protein Wuhan variant (Kp = 46.7 \pm 19.7 nM) and Omicron variant (K_D = 3.3 \pm 1.5 µM), of lipopolysaccharide to Wuhan S1 (K_D = 50.0 \pm 20.0 nM) and Omicron S1 (K_D = 4.6 \pm 1.7 µM), and of lipid A to subunit Wuhan S1 $(42.2 \pm 24.4 \text{ nM})$ and Omicron S1 (K_D = 0.6 ± 0.2 µM). Binding of lipopolysaccharide to Wuhan S2 $(K_D = 3.6 \pm 1.6 \mu M)$ had a weaker affinity than for S1 [71].

In a study that used machine learning models to identify inhibitors of SARS-CoV-2 through the repurposing of existing drugs, MST was used to measure binding of the antimalarial drug lumefantrine to the SARS-CoV-2 spike protein receptor binding domain (RBD). Residues 331 to 528 of the spike protein were expressed and purified and labelled with the amine reactive dye RED-NHS. Titration of lumefantrine with the spike protein RBD produced a K_D of 259 ± 78 nM [72]. MST measured binding of the fungal defensin micasin from Microsporum canis to the spike protein RBD. The latter was labelled with the fluorescent dye NT-495-NHS and in MST experiments titrated with wild-type micasin and some mutant forms. Micasin bound to the spike protein RBD with a K_D of 5.04 \pm 0.96 μ M [73]. A

various computational studv used and experimental approaches to identify molecules that could be optimised to improve anti-SARS-CoV-2 activity. Five beta-blockers (pindolol, carvedilol, carteolol, atenolol, and bisoprolol) against the SARS-CoV-2 spike protein RBD were identified. The highest affinity of these was carvedilol, for which MST measured a K_D value of 364 ± 22 nM [74]. In a study that designed high-affinity affibody ligands for purification of the RBD from coronavirus spike proteins, MST was used to measure binding of ZRBD-02 (K_D = 133.4 nM), ZRBD-04 (K_D = 377.3 nM), and ZRBD-07 ($K_D = 36.3$ nM) to the SARS-CoV-2 spike protein RBD [75].

One of the studies designed and tested six synthetic ACE2-based peptides to antagonise the interaction between ACE2 and the spike protein RBD based on molecular docking with crystal structures of their interface. The ability of the peptides to inhibit the ACE2-spike-RBD interaction was tested using a luciferase assay, then the affinity of peptide binding to the spike-RBD protein was measured by MST. The purified spike-RBD protein was fluorescently labelled and incubated with each peptide at a range of concentrations (12.5-0.00019 µM). Some of the peptides had binding affinities in the low nanomolar range, with the highest affinity peptides having K_D values of 13 and 45 nM [76]. In a different study synthetic α -helical peptides mimicking the a1-helix motif of the ACE2 receptor were tested as potential inhibitors of the ACE2 SARS-CoV-2 interaction. A series of peptides N-capped with either Ac-BHAsp-[ProM-5] or Ac-βHAsp-PP were tested and MST measurements demonstrated a strong binding affinity ($K_D = 62 \text{ nM}$) of an Ac- β HAsp-PP-capped peptide for the SARS-CoV-2 spike protein RBD [77]. MST was used to confirm how C-2 thiophenyl tryptophan trimers inhibit cellular entry of SARS-CoV-2 through interaction with the spike protein. MST measured binding of compounds to the spike protein and to its RBD. and also the effect of the compounds on interaction of the spike protein and its RBD with ACE2 [78]. Following a study to measure differential interactions between human ACE2 and the spike RBD of SARS-CoV-2 variants of concern [79], a later study used a combination of steered molecular dynamics (SMD) simulation and experimental MST to quantify the interaction between the Omicron variant of the RBD and human ACE2 [80]. MST measurements of binding between human ACE2 and different mutants of the RBD were directed by the SMD

simulation. It was identified that Omicron produces an enhanced RBD-ACE2 interaction through mutations N501Y, Q498R and T478K in the RBD. The Omicron variant of the RBD had a five-fold higher affinity for ACE2 ($K_D = 5.5 \pm 1.4$ nM) than did the wild-type RBD ($K_D = 27.5 \pm 4.8$ nM), and higher affinities than the RBDs of the Alpha ($K_D = 11.8 \pm 0.8$ nM), Beta ($K_D = 23.1 \pm 2.4$ nM) and Delta ($K_D = 21.5 \pm 2.9$ nM) variants [80].

6.2 G Protein-Coupled Receptors

Nine studies have employed MST to analyse binding interactions to different GPCRs. In a study that reported structure and function of the purified GPCR analvses human vomeronasal type 1 receptor 1, MST using native tryptophan residues as the fluorophore showed binding of hVN1R1 to its ligand myrtenal, giving an EC₅₀ of approximately 1 µM [81]. In three similar studies, MST was used to measure binding of human and mouse olfactory receptors and GPCRs solubilised with designer lipid-like peptides to their respective ligands. Here native tryptophan residues in the receptors were used as the fluorescence source for MST, and measured EC₅₀ values ranged from 0.9 to 86 µM [82-84]. In a study reporting the cell-free expression, purification and ligand-binding analysis of olfactory receptors DmOR67a, DmOR85b and DmORCO from Drosophila melanogaster, MST was used to demonstrate that they bind their respective ligands. DmOR67a and DmORCO were titrated individually and together with ethyl benzoate, while DmOR85b and DmORCO were titrated individually and together with 2-heptanone. When DmOR67a was co-incubated with DmORCO, ethyl benzoate bound with an affinity of $\sim 0.5 \pm 0.1 \mu$ M, and when DmOR85b was co-incubated with DmORCO, 2heptanone bound with an affinity of $\sim 0.8 \pm 0.2$ µM [85].

In a study that computationally designed and characterised nanobody-derived peptides (NDPs) to stabilise the active conformation of the human β2-adrenergic receptor (β2-AR), MST measured binding of a selected 17-residue NDP (P3) to the β 2-AR. The agonist(isoproterenol)activated B2-AR displayed a ~10-fold higher affinity for P3 than the unstimulated receptor, with EC₅₀ values of 3.57 µM and 58.22 µM. respectively [86]. MST was used to observe bindina of the peptide neurotransmitter neurotensin (NT) to the human dopamine receptor 1 (D1) under native conditions in polymer-assembled Lipodisqs (Fig. 3). The

Lipodisgs were formed by adding the copolymer stvrene-maleic acid (SMA) to membranes expressing D1 at a membrane:SMA w/w ratio of 1:1.5. MST measurements used Cy5-labelled NT, which had an estimated binding affinity for D1 Lipodisgs of >300 nM [87]. An MST method was developed to measure ligand/receptor binding in non-purified samples of the dopamine D2 receptor (D2R). The concentration of D2R in mammalian cell plasma membranes from induced HekD2 cells was determined to be 36.8 ± 2.6 pmol/mg. Dose-response curves determined the binding affinity (K_D) for the fluorescent ligand spiperone-Cy5 to be 5.3 ± 1.7 nM. To eliminate the possibility of nonspecific binding between spiperone-Cy5 and the cell membranes, the measurements were performed both in the absence and in the presence of the D2R antagonist haloperidol [88].

In a study demonstrating that down-regulation of the endothelial protein C receptor (EPCR) promotes preeclampsia by affecting actin polymerization. MST was used to observe direct binding of EPCR to protease-activated receptor 1 (PAR-1), which is a GPCR [89]. A plethora of techniques were used to identify macrophage migration inhibitory factor (MIF) as an atypical chemokine (ACK) that binds to chemokine receptors CXCR2 and CXCR4 to promote atherogenic leukocyte recruitment. This included use of MST to confirm the interaction between MST-Red-labelled MIF and platelet chemokine CXCL4L1. Titration of MST-Red-MIF with increasing concentrations of CXCL4L1 produced a binding constant ($K_D = 159.8 \pm 16.8$ nM) that was similar to that obtained by SPR (K_D = 116 ± 16 nM) [90].

6.3 Other Receptors

Various other receptors have been analysed by MST, including measurement of metallothionein binding to the lipocalin-2 (24p3/neutrophil gelatinase-associated lipocalin (NGAL)) receptor (SLC22A17) in CHO plasma membrane vesicles, giving an EC₅₀ of 123 \pm 50 nM [91]. MST was used to characterise interactions between the membrane-bound mucin MUC4 and the ErbB2 receptor, which occurs at the cancer cell surface. Lysates of CHO cells were used that contained the transmembrane β subunit of MUC4 (MUC4 β) or a mutant containing only the EGF domains (MUC4EGF3+1+2). K_D values for binding of ErbB2 to MUC4β-ErbB2 and MUC4EGF3+1+2 were measured at 7-25 nM and 65-79 nM, respectively [92].



Fig. 3. Binding of neurotensin (NT) to the human dopamine receptor 1 (D1) in polymer-assembled Lipodisgs

MST used Cy5-labelled NT (NT-Cy5). The affinity of NT-Cy5 for D1 Lipodisqs was >300 nM. Denatured D1 Lipodisqs and Lipodisqs formed from HEK cells lacking D1 (red and green curves, respectively) did not show binding to NT. Error bars represent the standard error of n = 3 measurements. This figure was reproduced from Bada Juarez et al. (2020) [87]

MST was used to analyse ligand-specific conformational states of the human glycine receptor (GlyR), which is a member of the pentameric ligand-gated ion channel (pLGIC) family. The fluorescent-labelled GlyR alpha-1 subunit was solubilised in amphipathic styrenemaleic acid copolymer nanodiscs. MST measurements showed that the full agonist glycine and the partial agonist taurine induced different conformational transitions on binding to the GlyR, giving EC₅₀ values of $65 \pm 22.8 \mu$ M and $473.8 \pm 66.1 \mu$ M, respectively (Figure 4). The results indicated that partial agonism in pLGIC proteins is reflected by the adaption of distinct receptor conformations [93].

MST was used to measure binding of FIP-nha (a fungal immunomodulatory protein from *Nectria haematococca*) to the labelled human epidermal growth factor receptor EGFR ($K_D = 15.54 \pm 2.93 \mu$ M) [94]. In a study that performed in silico screening of the binding affinities of fifty curcumin derivatives to the human EGFR by a molecular docking approach, MST was used to validate the results. The predicted EGFR-ligand binding constants were in the range of 0.00013 \pm 0.00006 to 3.45 \pm 0.10 μ M. MST measured binding constants for curcumin ($K_D = 5.1 \pm 0.33 \mu$ M), N-(3-nitrophenylpyrazole) curcumin ($K_D = 4.9 \pm 0.62 \mu$ M) [95].

A study demonstrated how the chemotherapeutic agent cisplatin interacts with toll-like receptor 4

(TLR4) to initiate proinflammatory signalling that underlies cisplatin toxicities. Soluble TLR4 blocked cisplatin-induced, but not lipopolysaccharide-induced, TLR4 activation. In MST experiments nickel and cisplatin, but not lipopolysaccharide, showed direct binding to human TLR4 with K_D values of 2.72 μ M and 50.57 μ M, respectively. Mouse TLR4 showed binding to cisplatin (K_D = 104.9 μ M) but not to nickel [96].

MST was used to measure binding of lipoprotein ligands to two human class B scavenger receptors, scavenger receptor class B type 1 (SR-B1) and CD36, which are receptors for highdensity lipoproteins and oxidized low-density lipoproteins, respectively. Using receptors labelled with Cy5 at lysine residues, SR-B1 bound to lipid-free apolipoprotein A-I with a K_D of $82 \pm 12 \ \mu g/ml$ or $2.73 \pm 0.40 \ \mu M$ and to holoparticle high-density lipoprotein (HDL) with a K_D of 52 ± 9 µg/ml or 194 ± 34 nM. CD36 bound oxidized low-density lipoprotein (oxLDL) with a K_D of 1.2 ± 0.5 mg/ml or 342.86 ± 285.71 nM and bound human HDL with a K_D of 33 ± 8 µg/ml or 123.36 ± 29.9 nM. There was no difference in affinity of SR-B1 for HDL or CD36 for oxLDL glycosylated when comparing and deglycosylated receptors [97].

MST was also used to measure binding of Staphylococcus enterotoxin B (SEB) to the human natural killer cell receptor 2B4 (CD244) [98].



Fig. 4. Binding characteristics of the partial agonist taurine to α1-GFP GlyR nanodiscs (a) Dose-response data for glycine and taurine of heterologous expressed α1 GlyR from Xenopus laevis oocytes. Taurine acts as a partial agonist with an a EC₅₀ value of 843 ± 16 µM reaching a maximum current of 61% compared to glycine (n = 3). Taurine currents are normalized to the maximum glycine currents for each cell. Error bars represent SEM. (b) MST binding experiment of α1-GFP GlyR with a taurine titration series of 6 µM to 12.5 mM results in a cEC₅₀ value of 473.8 ± 46.1 µM (n = 3). Error bars represent SEM. (c) Exemplary α1-GFP GlyR MST data of taurine (blue circles) and glycine (black circles) obtained from oocytes displaying a difference in their maximal thermophoretic mobility (grey and blue arrows). (d) Comparison of the signal amplitudes of α1-GFP GlyR SMALPs expressed in HEK293 cells and oocytes for glycine and taurine. Binding of taurine leads to a significantly decreased thermophoretic movement (p = 0.024, unpaired two-side t test, n = 3) with signal amplitudes of 1.32 ± 0.14 compared to glycine-bound receptors with signal amplitudes of 3.38 ± 1.09. Data are shown in mean ± SD. This figure was reproduced from Bernhard and Laube (2020) [93]

6.4 Sensor Kinases

MST has been used to analyse some histidine and tyrosine kinases. In a study that investigated interactions in the Cpx two component system of *E. coli*, MST was used to measure binding affinities between the sensor histidine kinase CpxA with its cognate response regulator CpxR and its accessory protein CpxP. CpxA was reconstituted in MSP1D1 nanodiscs and MST measurements used fluorescently-labelled CpxA-Strep or MSP1D1. CpxA had a high affinity for CpxR (K_D = 3.7 ± 0.5 μ M), which was increased by around 10-fold by phosphorylation (K_D = 0.55 ± 0.06 μ M). The affinity between CpxA and CpxP was much lower (K_D >100 μ M) [99].

A range of biophysical techniques and cell-based assays were used to identify a highly selective small molecule inhibitor of lemur tyrosine kinase 3 (LMTK3), which is a dual specificity serine/threonine kinase with an oncogenic role in various tumour types and a viable therapeutic target. The analyses included use of MST to obtain binding curves for the new inhibitor C36 ($K_D = 1.87 \pm 0.2 \mu$ M) and an existing inhibitor C28 ($K_D = 2.50 \pm 0.4 \mu$ M) with human LMTK3 [100].

6.5 Ion Channels

Several studies have used MST to analyse interactions with the voltage-dependent anion channel 1 (VDAC1). In a study that looked at mediation of the antiapoptotic activity of Bcl-xL protein upon interaction with mouse VDAC1, was used to observe binding MST of fluorescently labelled Bcl-xL to VDAC1, giving a binding affinity of 0.67 µM [101]. In a study that demonstrated direct modulation of human VDAC1 by cannabidiol (CBD), MST was used to show a direct interaction between purified fluorescently labelled VDAC1 and CBD, giving a K_D of 11.2 ± 6 μ M [102]. In a study that demonstrated how VDAC1 mediates amyloid ß $(A\beta)$ toxicity and is a potential target for

Alzheimer's disease therapy, MST was used to observe AB binding to fluorescently-labelled human VDAC1 with a Kp of 50 µm. In an MST experiment using intrinsic VDAC1 tryptophan fluorescence, A β binding resulted in a K_D of 16.6 µM [103]. Seventeen small-molecule compounds were screened for interaction with human mitochondrial VDAC1 using nano-differential scanning fluorimetry and MST (Figure 5). The dissociation constants for fifteen of the compounds were measured by MST with six successfully determined: DIDS ($K_D = 0.5 \,\mu$ M), VBIT4 ($K_D = 3 \mu M$), itraconazole ($K_D = 5 \mu M$), cannabidiol ($K_D = 6 \mu M$), curcumin ($K_D = 6 \mu M$), emodin ($K_D = 10 \,\mu$ M). It was noted that DIDS is likely to interact covalently with VDAC1, which should be considered in evaluating the measured K_D. Four of the compounds (cannabidiol, curcumin, DIDS and VBIT4) were identified as potential starting points for future design of VDAC1 selective ligands [104]. In a study that demonstrated how a cholesterol analogue induces an oligomeric reorganization of VDAC, MST was used to measure binding of hexokinase isoform I (HK-I) to VDAC from *Neurospora crassa*, giving a binding constant of 27 ± 6 μ M in the presence of cholesteryl-hemisuccinate. There was no binding of hexokinase isoform II (HK-II) [105].



Fig. 5. MST dose-response curves of eight compounds with human mitochondrial VDAC1. Precise or minimum K_D values are displayed for cannabidiol, curcumin, DIDS, emodin, itraconazole, VBIT4, propofol and fluoxetine. Error bars show standard deviation obtained from three replicas of the same measurement. This figure was reproduced from Gorny et al. [104]

In a study of competitive interactions between the phosphoinositide regulator of TRP (PIRT), the cold sensing ion channel TRPM8, and the signalling phosphoinositide lipid PIP2, MST was used identify a competitive PIRT interaction between PIP2 and the TRPM8 S1-S4 transmembrane domain [106].

MST measured binding of the tarantula gatingmodifier toxins ProTx-II and GpTx-I to the voltage sensing domain (VSD) of repeat II of the human voltage-gated sodium channel NaV1.7 [107]. Residues 732-860, which contain three transmembrane helices, were recombinantly expressed, purified and reconstituted in DMPC lipids. For MST, VSD2 in DMPC was titrated into 50 nM toxins fluorescently labelled with Alexa Fluor[™] 488. Binding affinities (K_D values) for ProTx-II and GpTx-I were measured at 200 nM (160-250 nM) and 700 nM (300-1500), respectively. In comparison, IC_50 values for ProTx-II inhibition of full-length NaV1.7 in membranes had been reported in the range 0.3-3 nM. Mutations F813A and D816A in VSD2 increased the K_D values for GpTx-I binding to 300 nM (600-3000) and 5000 nM (3000-15,000 nM), respectively [107].

In a study that demonstrated how chloride intracellular channel 1 (CLIC1) activity is not required for glioblastoma development, but its inhibition dictates glioma stem cell responsivity to novel biguanide derivatives, MST was used to measure the interaction of two biguanide compounds (Q48 and Q54) with recombinant CLIC1 protein. CLIC1 was labelled with red and blue dve kits and dose-response curves measured binding affinities of $K_D = 15.6 \pm 1.9 \,\mu M$ and $K_D = 1.9 \pm 0.5 \,\text{mM}$ for Q48 and Q54, respectively [108].

MST was used to measure direct interactions between phosphoinositides and potassium channel KcsA. Using a range of phospholipids it was found that there was a general increase in binding affinity with the number of negative phosphoinositides charges. The PI(4)P (phosphatidylinositol 4-phosphate), PI(3,4)P2 (phosphatidylinositol 3,4-bisphosphate), PI(4,5)P2 (phosphatidylinositol 4,5bisphosphate), PI(3,4,5)P3 (phosphatidylinositol 3,4,5-trisphosphate) with two to four net negative charges produced greater binding effects than POPC (1-palmitoyl-2-oleoylphosphatidylcholine) with no charge, and POPG (1-palmitoyl-2oleoylphosphatidylglycerol) and ΡI

(phosphatidylinositol) with one net negative charge [109].

MST was also used to measure the direct interaction between the purified voltage-gated proton channel (Hv1) from mouse and ATP [110].

6.6 Aquaporins

MST has been used to measure interactions with some aquaporins. In a study that demonstrated how phosphorylation of human aquaporin 2 (AQP2) allosterically controls its interaction with the lysosomal trafficking regulator-interacting protein LIP5, MST was used to measure binding of fluorescently-labelled LIP5 to wild-type and mutant forms of AQP2. Non-phosphorylated wildtype AQP2 bound LIP5 with the highest affinity $(K_D = 191 \pm 43.2 \text{ nM})$, whilst AQP2- Δ P242 had 20-fold lower affinity ($K_D = 3.63 \pm 0.44 \mu M$). AQP2-S256E (K_D = 1.00 ± 0.25 µM), S261E (K_D $= 745 \pm 141$ nM). T269E (K_D = 721 \pm 55.0 nM). and S256E/T269E (Kp = 652.7 ± 62.2 nM) all had reduced affinity. AQP2-S264E had an affinity similar to non-phosphorylated wild-type AQP2 (K_D = 278 ± 49.1 nM) [111]. More recently, a protocol was developed for characterizing the binding between a human aquaporin and a soluble interaction partner using MST [112], and MST was used to measure the interaction of Zea mays aquaporin ZmPIP2;5 with the jasmonic acid analogue coronatine [113].

6.7 Transporters

Interactions with a variety of transport proteins have been analysed by MST, including binding of purine and pyrimidine nucleosides to equilibrative (ENT7) nucleoside transporter 7 from Arabidopsis thaliana fused with eGFP [114]. An MST ligand-binding assay for characterising solute carriers was demonstrated using the SLC15 oligopeptide transporter PepT1. An SLC15A1/PepT1 ortholog from the moss Physcomitrella patens (PepTPp), which is highly similar to human PepT1, was expressed in yeast. The method compared the analysis of solubilised total membrane preparations with or without expression of PepTPp, using a yeast strain (Saccharomyces cerevisiae), in which the corresponding endogenous SLC homolog is depleted and using the dipeptide glycylsarcosine (Gly-Sar) and the antiviral prodrug valacyclovir as test ligands. Gly-Sar was bound in the mM range and valacyclovir had a K_D of around 50 µM [115].

In a study that dissected the protonation sites for antibacterial recognition and transport in the multidrug efflux transporter QacA from Staphylococcus aureus, MST was used to measure binding of substrates to purified wildtype and mutant forms of QacA. Wild-type QacA values had KD for binding tetraphenylphosphonium, pentamidine and degualinium of 0.36 \pm 0.07 mM, 1 \pm 0.17 mM and 0.90 ± 0.21 mM, respectively [116].

In a study that identified a grafted hyaluronic acid N-acetyl-I-methionine (HA-ADH-AcMet) to target the human L-type amino acid transporter-1 (LAT1), MST was used to measure the binding affinity of different ligands to LAT1. The highest affinity ligand was HA-ADH-AcMet with a K_D of 408 nM [117].

In a study investigating functional sites in the Major Facilitator Superfamily (MFS) efflux protein NorA from Staphylococcus aureus, MST was used measure the bindina to of tetraphenylphosphonium chloride to GFP-fused wild-type and mutant NorA. GFP was fused between residues 153 and 154 of NorA, flanked by a peptide 'GGSGG'. Tetraphenylphosphonium chloride binding to GFP-NorA and a multisite mutation (F16A/E222A/F303A/D307A) of GFP-NorA had K_D values of 7.6 \pm 2 mM and 16.7 \pm 6 mM, respectively [118].

Along with other techniques, MST was used in a study of the structural basis for arsenite binding and translocation of the Acr3 antiporter from Bacillus subtilis [119]. Acr3 is an efflux pump that confers resistance to arsenite, it has nine transmembrane helices that display a typical NhaA structure fold, with two discontinuous helices of transmembrane segments (TM4 and TM9) interacting with each other and forming an X-shaped structure. MST measured arsenite binding to GFP-labelled wild-type Acr3 and individual mutants of Acr3 (R118A, N144A, E295A, E322A) to give K_D values of 2.9, 14.8, 11.9,19.6 and 27.5 mM, respectively (Figure 6). The study identified motif C in TM9 to be critical for substrate binding, in which N292 and E295 are involved in substrate coordination, while R118 in TM4 and E322 in TM10 are responsible for structural stabilization. Highly conserved residues on motif B in TM5 were found to be important in the protonation/deprotonation process [119].

A comprehensive study on the energy coupling and stoichiometry of Zn^{2+}/H^+ antiport by the

cation diffusion facilitator YiiP from Shewanella oneidensis used MST to assess the binding affinity of individual Zn2+ binding sites and to explore the basis for coupling of Zn²⁺ transport to the proton-motive force [120]. YiiP functions as a homodimer and has three distinct Zn²⁺ binding sites referred to as A, B and C. Site A is in the transmembrane domain and has three Asp and one His residue where it is alternately exposed to the cytoplasm or to the periplasm in inward- and outward-facing states, respectively. Site B is on the loop between transmembrane helices 2 and 3 and has two His and one Asp residue. Site C is in the C-terminal domain and is a binuclear site (C1 and C2) with four His and two Asp residues. For assessing Zn²⁺ binding to individual Zn²⁺ binding sites a series of mutants was used to isolate the individual sites. The triple mutant D70A/D287A/H263A was used to study site A, D51A/D287A/H263A was used to study site B. and D51A/D70A was used to study site C. At pH 7, MST measured relatively high affinity for sites A and C with K_D values of 16 nM and 33 nM, respectively, and lower affinity for site B with a K_D value of 1.2 μ M. When further mutations were introduced to isolate the individual C1 (D51A/D70A/H263A) and C2 (D51A/D70A/H234A) sites, the binding affinity was reduced to give K_D values of 153 nM and 223 nM, respectively, suggesting cooperative binding of Zn²⁺ at C1 and C2 [120]. The basis for coupling of Zn²⁺ transport to the proton-motive force was investigated by measuring Zn2+ binding affinities at pH values of 5.6 to 7.4.

6.8 Other Membrane Proteins

In a study that investigated unwinding of the substrate transmembrane helix in intramembrane proteolysis, MST measured binding of a chimeric substrate MBP-Gurken-TMD to wild-type and mutant forms of the intramembrane-cleaving proteases (I-CLiPs) rhomboid protease GlpG from E. coli and MCMJR1 from archaea. GlpG and MCMJR1 were labelled with fluorescent dye NT-647. MBP-Gurken-TMD bound to wild-type and a mutant (H254A) of GlpG in 0.1% DDM with K_D values of ~1.4 μ M and ~0.7 μ M, respectively (Figure 7). Binding did not reach saturation because a higher concentration of substrate could not be achieved due to aggregation. MBP-Gurken-TMD bound to MCMJR1 in 0.1% DDM with a K_D of ~9 μ M [121].

In a study that demonstrated how lysosomal integral membrane protein-2 (LIMP-2/SCARB2) is involved in lysosomal cholesterol export, MST

was used to detect a direct interaction between fluorescently labelled human LIMP-2 and cholesterol, giving an EC₅₀ of 112 ± 32 nM [122]. In a study that demonstrated how human tetraspanin CD82 interacts with cholesterol to promote extracellular vesicle-mediated release of ezrin to inhibit tumour cell movement, MST was used to determine the cholesterol-binding affinity of CD82. MST was performed on GFPlabelled wild-type and LYK mutant CD82 proteins expressed at similar levels in Du145 cells. Cholesterol bound to CD82-wild-type with a K_D of 5.89 μ M but did not bind to CD82-LYK [123].

MST was used to show how the human phosphoinositide-interacting regulator of TRP (PIRT) binds calmodulin and cholesterol-like ligands. PIRT had high affinity for calcium-free calmodulin (apo-CaM) and lower affinity for calcium bound calmodulin, with K_D values of 350 \pm 40 nM and 60 \pm 30 μ M, respectively. Cholesteryl-hemisuccinate had a K_D of 103 \pm 6 μ M, and cortisol and β -estradiol had K_D values of 790 \pm 60 μ M and 800 \pm 100 μ M, respectively. Despite the structural similarity of testosterone to cholesterol, cortisol and β -estradiol, it did not show binding to PIRT [124].

Occludin is a tetramembrane-spanning tight junction protein, which possesses a bundle of three α -helices that mediates interactions with other tight junction components. A study demonstrated that serine 408 phosphorylation is a molecular switch that regulates structure and function of occludin, where a short unstructured region next to the α -helical bundle is a hotspot for phosphorylation. Here NMR was used to

define the effects of S408 phosphorylation on intramolecular interactions between the unstructured region and the α -helical bundle, then paramagnetic relaxation enhancement and MST were used to demonstrate that the unstructured region interacts with the α -helical bundle, and binding was enhanced by S408 phosphorylation [125].

MST with nanodiscs was used to confirm the micromolar affinity of perforin for calcium ions, which is required for perforin interaction with the membrane. MSP nanodiscs containing 1-palmitoyl-2-oleoyl-sn-glycero-3-phosphocholine (POPC) and 1,2-dioleoyl-sn-glycero-3-phosphoethanolamine (DOPE) labelled with fluorescent dye Atto-647 (DOPEAtto-647) were used to reconstitute human and mouse perforin, giving K_D values of 123 \pm 33 μ M and 26 \pm 5.8 μ M, respectively [126].

Using multiple biophysical techniques, it was demonstrated that human mitochondrial fission protein 1 (Fis1) directly interacts with dynamin related protein 1 (Drp1) in an evolutionarily conserved manner to promote mitochondrial fission. For MST experiments. Fis1 with its Nterminal arm removed (Fis1AN9-125) and Drp1 were covalently modified at methionine residues Cy5-azide fluorophore. Propargyl with а oxaziridine was used to generate a sulfimide conjugate to methionine containing a terminal alkyne, then copper click chemistry was used to attach Cy5. In MST experiments monitoring Cys5-Drp1 fluorescence, 30 µM Drp1 was titrated with Fis1 Δ N to give an apparent affinity (app K_D) of Drp1 for Fis1 Δ N of 12 ± 2 μ M (Figure 8) [127].



Fig. 6. MST analysis of arsenite binding to GFP-labelled wild-type and mutant forms of the Acr3 antiporter from *Bacillus subtilis*

Affinity analysis with a K_D model and fitted by fraction bound normalisation. Experiments were conducted in triplicate. This figure was reproduced from Lv et al. [119]



Fig. 7. MST binding curves of the P252A MBP-Gurken-TMD variant to wild-type GlpG and the inactive H254A GlpG variant in 0.1% DDM This figure was reproduced from Brown et al. [121]





A. Box plot depicting the global unfolding temperature (T_m) of 30 μ M Drp1 in the presence of increasing Fis1 Δ N (0-30 µM). T_m values determined as the temperature corresponding to the first derivative of the maximum fluorescence value. N=2 for each titration point. B. &Fluorescence values of 80 nM Cy5-Drp1 in the presence of increasing Fis1 ΔN as determined by MST and fit to a single-site binding model to determine an apparent K_D value. Δ Fluorescence values normalized to a 0-1 scale to allow for comparisons and averaging between multiple experiments (n=3), error bars=SD. This figure was reproduced from Nolden et al. [127]

7. CONCLUSION

In reviewing the analysis of membrane proteins by MST we have consolidated the opinion that MST is a useful technique for studying biomolecular interactions with membrane proteins. This is because MST has no limitations on the size of the target biomolecule, on the affinity of the interaction being studied or on the composition of the buffer and other sample components, and it uses much less sample compared to other techniques that measure biomolecular interactions. Different types of membrane proteins from different organisms have been studied by MST with the protein in cell lysates or native membranes, solubilised in

detergents, or reconstituted in lipids, nanodiscs or Lipodisgs. Very few of these studies used intrinsic aromatic residues as the fluorophore for MST measurements. The large majority of studies used proteins labelled with different fluorescent dyes or conjugated with GFP. It is important that the sample conditions and the labelling strategy being used for MST measurements do not adversely affect the native structure and activity of the protein. The best studies are therefore those that use other biophysical and biochemical techniques alongside MST to test the structural integrity and activity of the membrane protein under the same conditions as those used for MST. The many interactions that MST can measure with membrane proteins include those with other proteins and peptides, nucleic acids, detergents and lipids, liposomes and vesicles, or small molecules and ions. MST is therefore a useful technique to have in drug screening projects with membrane protein targets.

COMPETING INTERESTS

Authors have declared that no competing interests exist.

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