



Determination of half-maximal inhibitory concentration using biosensor-based protein interaction analysis



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ABSTRACT

Half-maximal inhibitory concentration (IC₅₀) is the most widely used and informative measure of a drug's efficacy. It indicates how much drug is needed to inhibit a biological process by half, thus providing a measure of potency of an antagonist drug in pharmacological research. Most approaches to determine IC₅₀ of a pharmacological compound are based on assays that utilize whole cell systems. While they generally provide outstanding potency information, results can depend on the experimental cell line used and may not differentiate a compound's ability to inhibit specific interactions. Here we show using the secreted Transforming Growth Factor- β (TGF- β) family ligand BMP-4 and its receptors as example that surface plasmon resonance can be used to accurately determine IC₅₀ values of individual ligand-receptor pairings. The molecular resolution achievable with this approach can help distinguish inhibitors that specifically target individual complexes, or that can inhibit multiple functional interactions at the same time.

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Introduction

Cytokines and growth factors play fundamental roles in animal cell physiology and human disease [1,2]. They help regulate cell differentiation, proliferation, migration, plasticity, and survival, but their dysregulation can lead to inflammation, fibrosis, cancers, and other devastating diseases [3,4]. Thus, they have elicited much medical interest and a number of therapeutics that target these secreted proteins have been approved for clinical use [5,6]. The two most common classes of therapeutics used to target cytokines and growth factors are monoclonal antibodies [7] and chimeric receptor-Fc fusion proteins, a.k.a. ligand traps [8]. Both aim to inhibit biological activity by blocking functional interactions with receptors and other binding partners [9].

Possibly the most relevant *in vitro* measure used to evaluate the

therapeutic potential of a monoclonal antibody, ligand trap or other pharmacologic agent is half-maximal inhibitory concentration, a.k.a. IC₅₀ [10–12]. It indicates how much of a specific pharmacologic agent is required to inhibit a given biological activity by half. Methods used to obtain IC₅₀ values generally rely on whole cell systems. They provide essential potency information and are especially useful when evaluating therapeutics that target pathways with few components. However, they can be deficient when evaluating inhibitors of cytokines or growth factors, such as members of the TGF- β , Wnt, FGF, EGF, and interleukin families that have pleiotropic activities and that can interact with many different components. Members of these families can engage multiple receptors for signaling, are also regulated by 'co-receptors', which potentiate or suppress biological activity, and even act as regulators of other family members by competing for receptor binding [13–16]. Thus, it is suggested their function is 'context dependent' [17–20]. In these cases, IC₅₀ values can depend on experimental cell line used and may not inform well on the efficacy of blocking a specific interaction.

To obtain IC₅₀ values of individual cytokine/growth factor–inhibitor interactions, we implemented an interaction specific surface plasmon resonance (SPR) approach, and we turned to the TGF- β family ligand BMP-4 as model cytokine/growth factor, plus

Abbreviations: SPR, surface plasmon resonance; SEC, size exclusion chromatography; IC₅₀, half maximal inhibitory concentration; Cer–Fc, Cerberus Fc fusion protein; TGF- β , transforming growth factor- β ; BMP, bone morphogenetic protein; ActRIIA, Activin receptor 2A; ActRIIB, Activin receptor 2B; BMPRII, bone morphogenetic protein receptor 2; ALK3, Activin-like kinase 3.

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the embryonic Nodal/BMP antagonist Cerberus as model inhibitor. Like all members of the TGF- β family, BMP-4 signals by forming a complex with two 'type I' and two 'type II' TGF- β receptors, namely the type I receptor ALK3 and the type II receptors ActRIIA or BMPRII [21]. Cerberus is a secreted protein that binds and inhibits several TGF- β family ligands with mid picomolar to low nanomolar affinities, including Activin B, Nodal, BMP-6 and BMP-7 [22,23].

Here, we show BMP-4 is a new high affinity Cerberus ligand. Using SPR, we demonstrate Cerberus inhibits BMP-4 binding to its type I and type II receptors in a concentration dependent manner, as increasing Cerberus concentrations reduce the BMP-4 dependent SPR signal. Importantly, the Cerberus dependent reduction in the SPR response can be used at any point of the association and dissociation phase to calculate IC₅₀ using standard software such as GraphPad Prism. Similarly, IC₅₀ can be calculated from kinetic parameters obtained by fitting individual concentration curves. We discuss merits of the two different approaches for IC₅₀ determination. In addition, we obtained IC₅₀ using a whole cell system. We discuss differences between the SPR and cell-based approaches in light of the complex composition of the cell surface and the various interactions of BMP-4. Notably, the molecular resolution achievable with the SPR format can help map inhibitor binding sites and thus help guide design of novel agents that selectively block formation of specific biological complexes.

Materials and methods

Proteins expression and purification

Recombinant human BMP-4 (Q53XC5) was obtained from R&D Biosystems (RnD, carrier free). Synthetic genes consisting of human Cerberus (O95813), ActRIIA (P27037), and ALK3 (P36894) fused to human IgG1-Fc via a linker containing a Tobacco Etch Virus (TEV) protease site were obtained from GeneArt. Two point mutations (R82G and C206A) were introduced in Cerberus by PCR (Cer-Fc) [22]. Human BMPRII (Q13873) was cloned from cDNA and fused to human IgG1-Fc by PCR. NCBI-protein accession numbers are shown in parenthesis. Fc-fusion proteins were expressed using suspension adapted Chinese Hamster Ovary (CHO) cells and purified from condition medium using Protein A capture followed by size exclusion chromatography (SEC). The Fc portion of Cerberus (C206A) was removed with TEV protease, followed by two steps of protein A capture, and SEC. All purified proteins were dialyzed into phosphate-buffered saline, pH 7.5 and stored at -20°C or -80°C . The purity of the proteins was checked with SDS-PAGE under reducing and non-reducing conditions.

Surface plasmon resonance

Experiments were performed on a Biacore 2000 at 25°C using HBS-EPS/BSA as running buffer (0.01 M HEPES, 0.5 M NaCl, 3 mM EDTA, 0.005% (v/v) Tween 20, 0.1% BSA, pH 7.4). A high flow rate (50 $\mu\text{L}/\text{min}$) and low surface loading were used to minimize mass transport artifacts. Anti-human IgG (Fc) was immobilized onto four channels of a CM5 chip using amine-coupling chemistry. The cross-linked antibody on the experimental flow channels was used to capture receptor-Fc-fusion proteins (approximately 200–300 RU were loaded on each channel). For binding assays, different concentrations of BMP-4 were injected over experimental and control flow channels loaded with Cer-Fc, ActRIIA-Fc, BMPRII-Fc or ALK3-Fc. As binding curves appear to be bi-phasic [24], data were fitted to a 1:1 Langmuir interaction model with mass transport limitation and to a heterogeneous ligand-binding model using BiaEvaluation software. Both models gave similar kinetic rates for ActRIIA-Fc, BMPRII-Fc and Cerberus-Fc, but not for ALK3 (Table 1). Notably, bi-

Table 1
BMP-4^a binding constants.

Chip:	Model	k_a	k_d	K_d	χ^2
Cerberus	1:1 ^{ms}	$(1.10 \pm 0.12) \times 10^5$	$(3.01 \pm 0.04) \times 10^{-4}$	2.73	0.292
	1:1 ^{hl}	$(8.25 \pm 0.92) \times 10^4$	$(1.85 \pm 0.06) \times 10^{-4}$	2.24	0.276
ActRIIA	1:1 ^{ms}	$(1.18 \pm 0.11) \times 10^5$	$(3.37 \pm 0.41) \times 10^{-4}$	2.85	0.398
	1:1 ^{hl}	$(1.04 \pm 0.28) \times 10^5$	$(3.39 \pm 0.38) \times 10^{-4}$	3.26	0.862
BMPRII	1:1 ^{ms}	$(7.63 \pm 1.4) \times 10^4$	$(5.62 \pm 0.24) \times 10^{-4}$	7.36	0.164
	1:1 ^{hl}	$(3.79 \pm 0.69) \times 10^4$	$(3.08 \pm 0.56) \times 10^{-4}$	8.13	0.113
ALK3	1:1 ^{ms}	$(7.78 \pm 1.8) \times 10^4$	$(1.50 \pm 0.74) \times 10^{-5}$	0.193	0.177

Units are: k_a ($\text{M}^{-1} \text{s}^{-1}$), k_d (s^{-1}), K_d (nM), χ^2 (RU²).

ms: mass transport limited model.

hl: heterogeneous ligand binding model.

^a Carrier free BMP-4 from RnD Systems.

phasic behavior can be fitted equally well by different models, indicating it is nearly impossible to identify the source of the complex behavior using kinetic data [24]. But the 1:1 Langmuir interaction model with mass transport limitation was selected because it gave the best fit as determined by χ^2 (<1). Equilibrium dissociation constants (K_d) were determined by calculating the ratio of binding and dissociation rate constants. Results are summarized in Table 1. For inhibition analysis, ActRIIA-Fc, BMPRII-Fc, ALK3-Fc, or Cerberus-Fc were captured on the sensor chip. Between 150 and 200 RUs ActRIIA-Fc, BMPRII-Fc, ALK3-Fc, or Cerberus-Fc were captured to minimize steric hindrance and mass transport artifacts. 60 nM BMP-4 preincubated with different concentrations of Fc-free Cerberus was injected over experimental and control flow channels. IC₅₀ values for SPR inhibition data were determined using GraphPad. Results are summarized in Table 2. After each binding cycle, the antibody surface was regenerated to base line with MgCl_2 . The reference channel was monitored to account for nonspecific binding, drift, and bulk shifts. Sensorgrams were analyzed by double referencing. Concentration dependent association rate constants (k_a , $\text{M}^{-1} \text{s}^{-1}$) of single curves were obtained by individual fitting using BiaEvaluation software. Local observed rate constants (k_{obs} , s^{-1}) values were calculated as $k_a \cdot \text{Conc} + k_d$ using BiaEvaluation software.

Reporter assays

HepG2 cells (HB-8065) were obtained from ATCC (American Type Culture Collection). Cells were maintained according to ATCC culture conditions. Briefly, freshly thawed cells were passaged at least three times before performing assays. $\sim 10,000$ HepG2 cells/well in complete medium (Eagle's Minimum Essential Medium supplemented with 10% FBS and 1% P/S) were seeded in a 96-well plate and grown overnight. Each well was transfected with 0.25 μL lipofectamine 2000, 200 ng of the SMAD1/5/8 responsive reporter plasmid pGL3 [luc2P/BRE] pGL3.48 and 2 ng of the [Luc2P/hRluc/TK] vector (control luciferase reporter plasmid, Promega, E6921). Transfection medium was removed the following day, and replaced with assay medium containing BMP-4 (1 nM) $\pm$ Cer-Fc (0–600 nM). After adding assay medium, cells were incubated for 16 h and luciferase activity was detected with a homemade dual-glow luciferase assay [25] using a FluoStar Omega plate reader.

Table 2
IC₅₀ values.

Interaction:	IC ₅₀ (150 s)	IC ₅₀ (300 s)	IC ₅₀ (750 s)	IC ₅₀ (k_a)	IC ₅₀ (k_{obs})
Cerberus	56.7 $\pm$ 3.3	57.6 $\pm$ 3.3	46.6 $\pm$ 3.0	99.7 $\pm$ 21	99.7 $\pm$ 21
ActRIIA	266 $\pm$ 44	305 $\pm$ 61	239 $\pm$ 71	56.0 $\pm$ 24	58.0 $\pm$ 25
BMPRII	166 $\pm$ 28	153 $\pm$ 26	132 $\pm$ 20	138 $\pm$ 62	153 $\pm$ 73
ALK3	289 $\pm$ 81	303 $\pm$ 83	245 $\pm$ 71	134 $\pm$ 54	132 $\pm$ 53

Relative luciferase units (RLU) were calculated by dividing firefly luciferase units (fLU) with renilla luciferase units (rLU). IC₅₀ values were calculated using GraphPad.

Statistical analysis

Reporter gene assays were repeated at least two times and performed in quadruplicates. One-way analysis of variance (ANOVA) and Dunnett's post hoc test as implemented in GraphPad Prism 6 was used to calculate statistical significance using all experimental values. Data are expressed as mean of four biological replicates $\pm$ standard error S/E.

Results and discussion

Establishing the BMP-4 – receptor interaction network

Cerberus is a secreted protein that binds and antagonizes several TGF- β family ligands during embryonic development. To evaluate the inhibitory efficacy of Cerberus, we turned to the newly discovered Cerberus target ligand BMP-4. We first characterized BMP-4 interactions with Cerberus and with its receptors. Briefly, we captured Cerberus-Fc, or the TGF- β family receptor-Fc fusion proteins ALK3-Fc, ActRIIA-Fc, and BMPRII-Fc on a Biacore sensor chip and injected a concentration series of BMP-4 (Fig. 1, Table 1). BMP-4 bound both Cerberus-Fc and the type I receptor-Fc fusion protein ALK3-Fc with high affinity ($K_d = 2.7$ nM and 0.2 nM, respectively) (Fig. 1A and B). BMP-4 binding to the type II receptor-Fc fusion protein ActRIIA-Fc was strong, but binding to BMPRII-Fc was slightly weaker ($K_d = 2.8$ nM, and 7.4 nM, respectively) (Fig. 1C and D). Together, these findings show BMP-4 binds Cerberus, the type I receptor ALK3 and the type II receptors ActRIIA and BMPRII with mid picomolar to low nanomolar affinity.

Obtaining SPR based inhibition data

To obtain Cerberus IC₅₀ values for individual BMP-4 – receptor interactions, we established an SPR based approach (see Fig. 2 for

experimental design). We captured ActRIIA-Fc, BMPRII-Fc or ALK3-Fc on the sensor chip and injected BMP-4 (60 nM) preincubated with different concentrations of Fc free Cerberus (0 nM–4800 nM) over the captured receptors (Figs. 3 and 4). In this format, Cerberus must be free of Fc to avoid Fc capture by the anti-human Fc antibody that is cross-linked on sensor chip. We hypothesized that the BMP-4 dependent SPR signal will decrease with increasing Cerberus concentrations, if Cerberus inhibits that particular BMP-4 – receptor interaction (Figs. 3 and 4). We tested both type I and type II receptors, as each receptor type interacts with a unique BMP-4 epitope [13,26,27], offering two independent experimental examples. Cerberus prevented BMP-4 binding to ActRIIA-Fc, BMPRII-Fc, and ALK3-Fc, as seen in the concentration dependent reduction of the SPR signal (Fig. 3A–C). Cerberus alone did not bind receptors or the sensor chip.

Calculating half-maximal inhibitory concentration from SPR data

To quantitate SPR inhibition data and obtain inhibitory potency information, we evaluated different approaches that allowed us to calculate IC₅₀ values. First, we evaluated simple response unit (RU) data taken at different time points of the SPR reaction (Fig. 3D and E). We used the blank-injection adjusted RU values for each Cerberus concentration at a specified time point (Fig. 3A, D and E). To obtain half maximal inhibitory concentration values (IC₅₀), we fitted BMP-4 binding dependent RU values as function of Cerberus concentration using the non-linear regression algorithm for log (concentration) versus normalized response implemented in GraphPad (Table 2). We found IC₅₀ values determined at different time points of the SPR reaction were similar (Fig. 3D, Table 2). With respect to experimental time point selected for the calculations, IC₅₀ values were consistently lower at 750 s (middle of the dissociation phase). IC₅₀ values were consistently higher when using RU data at 150 s (middle of the association phase) and at 300 s (end of the association phase). But at 300 s, IC₅₀ values showed the overall greatest trend variability. We speculate data taken in the middle of the association or dissociation phases are more consistent than data taken at the junction between association and dissociation phases

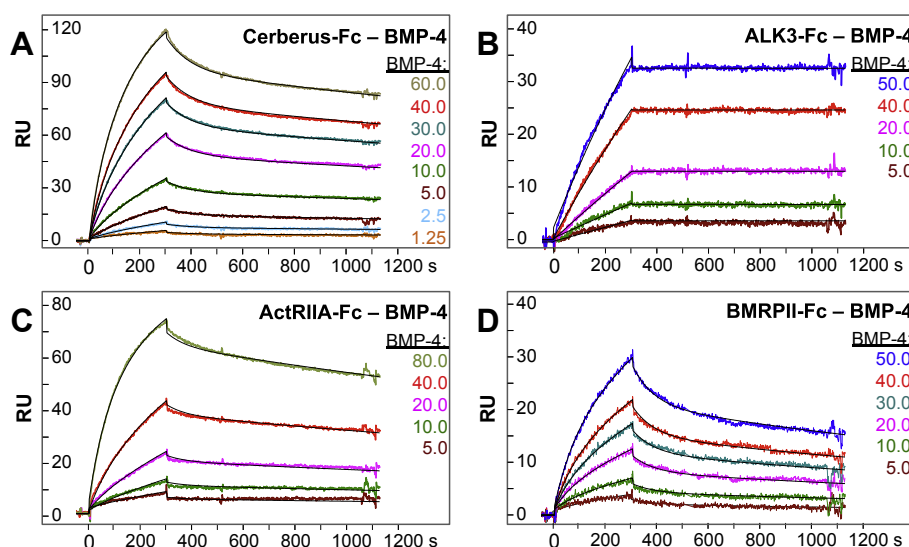


Fig. 1. BMP-4 binding to Cerberus and receptors. (A) BMP-4 – Cer-Fc interaction. Cer-Fc was captured on the sensor chip and different concentrations of BMP-4 as shown were injected. (B) BMP-4 – ALK3-Fc interaction. ALK3-Fc was captured on the sensor chip and different concentrations of BMP-4 as shown were injected. (C) BMP-4 – ActRIIA-Fc interaction. ActRIIA-Fc was captured on the sensor chip and different concentrations of BMP-4 as shown were injected. (D) BMP-4 – BMPRII-Fc interaction. BMPRII-Fc was captured on the sensor chip and different concentrations of BMP-4 as shown were injected. (A–D) Colors of injection curves are matches with corresponding concentrations. Fitted curves (black lines) are superimposed over all experimental curves. Calculated binding rate constants and equilibrium dissociation rate constants are shown in Table 1.

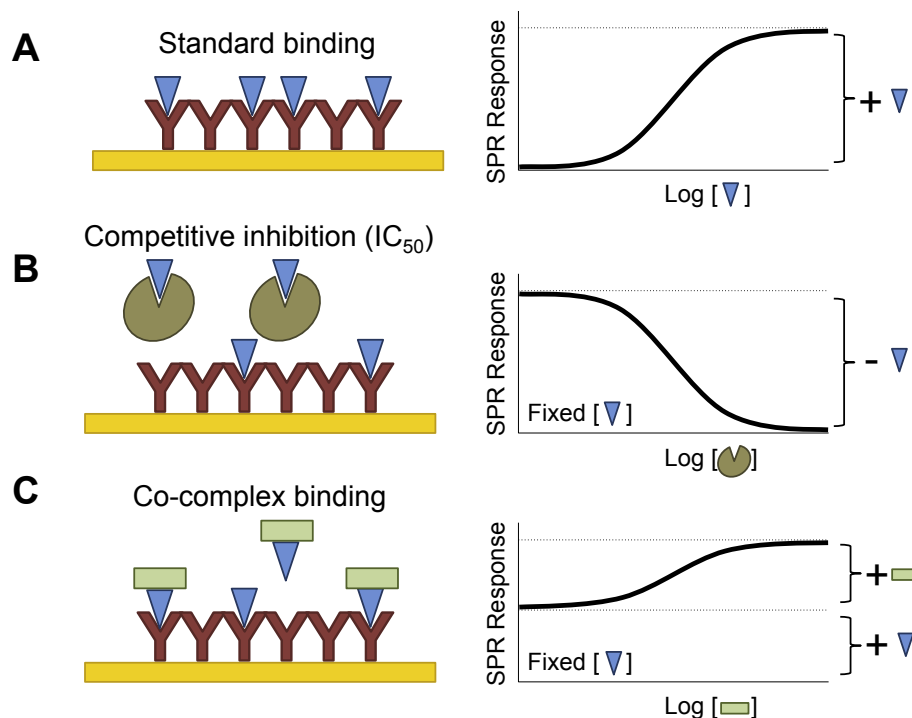


Fig. 2. Experimental design. (A) In a typical SPR binding experiment (left panel), the 'analyte' (BMP-4, shown as a blue triangle) is injected at increasing concentrations over the captured 'ligand' (ActRIIA-Fc, BMPRII-Fc, ALK3-Fc, Cerberus-Fc, etc., shown as a Y shape). When analyte binds to ligand, the SPR response increases with increasing analyte concentration until the surface is saturated by the analyte (see Fig. 1). The binding-curve conforms to a Langmuir adsorption isotherm (right panel). (B) In the equilibrium displacement or competitive inhibition format (left panel), the analyte concentration is fixed at a level that results in ~80% saturation. The injected sample is preincubated with increasing concentrations of 'inhibitor' (Fc free Cerberus, shown as brown shape). The analyte mediated SPR response decreases with increasing inhibitor concentration. The resulting inhibition curve follows an inversion of the Langmuir adsorption isotherm (right panel). (C) If the putative inhibitor forms a complex with the analyte that can bind the captured ligand (left panel), the starting SPR response corresponds to the free analyte response. The SPR response increases with increasing concentration of the co-binder (shown as green square) until all analyte is captured in a complex. This binding-curve also conforms to a Langmuir adsorption isotherm (right panel). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

(Fig. 3A–C), as signal noise increases during the sample to buffer transition. Regardless, all IC_{50} values fell within the calculated 95% confidence interval for each of the three time points (Fig. 3D and E), indicating that, in good approximation, SPR RU data can be taken directly at any time point of the SPR reaction to obtain robust information on specific inhibitory potency of a compound. Notably, reproducibility is extremely high once the SPR experiment is properly set up. Errors between measurements are consistently less than 5% (Fig. 3D).

In addition to the RU based approach, we also examined a mathematical approach of IC_{50} determination. Namely, we obtained IC_{50} values based on the apparent association rate constant (k_a , $M^{-1} s^{-1}$) (Fig. 3F and G) and the observed rate constant (k_{obs} , s^{-1}) (Fig. 3H) for each Cerberus concentration. Rate constants were calculated individually for each Cerberus concentrations using biaevaluation. Concentration dependent k_a and k_{obs} values were fitted using the non-linear regression algorithm implemented in GraphPad. We found both rate constants and fitted curves showed the expected, dose dependent decrease and sigmoidal shape that is characteristic of a competitive inhibitor (Fig. 3G and H). As expected, IC_{50} values were highly comparable between the k_a and k_{obs} determinations given their linear relationship (Table 2). But we found differences when comparing k_a and k_{obs} with the simpler RU analysis. IC_{50} values for ALK3 and ActRIIA were, respectively, 2-fold and 4- to 6-fold lower for IC_{50} determined using k_a or k_{obs} , whereas IC_{50} values for BMPRII were similar. Fitting errors for IC_{50} values obtained from kinetic rate constants were significantly larger than fitting errors obtained using RU values (Fig. 3D and F, Table 2), indicating IC_{50} values obtained from kinetic rate constants are less

precise. The decreased precision likely results from estimating k_a and k_{obs} values by individual fitting of single concentration curves.

In summary, our data demonstrate Cerberus blocks binding of BMP-4 to the type I receptor ALK3 and the type II receptors ActRIIA and BMPRII with high potency. We describe several approaches for calculating IC_{50} values for individual BMP-4 receptor interactions. The different approaches are consistent with each other. Importantly, IC_{50} determination using SPR can be broadly used as demonstrated by analysis of Activin B inhibition with Cerberus (Fig. 3I) [22,23].

Evaluating RU- and rate constant-based IC_{50} values

As different SPR based approaches can be used to obtain IC_{50} values, we asked which approach delivers the most meaningful result. To answer this question we turned to Cerberus inhibition of BMP-4 – Cerberus-Fc binding. Given Cerberus and Cerberus-Fc have nearly identical affinities for BMP-4 (i.e. $K_i = K_d$), we hypothesized that the most accurate SPR-based approach should produce an IC_{50} value that is similar to the K_d value from the Cerberus-Fc – BMP-4 binding experiment at the given BMP-4 $[S]$ concentration (i.e., based on the Cheng-Prusoff equation, if $IC_{50} = K_i(1 + [S]/K_d)$ and $K_i = K_d$, then $IC_{50} = K_d + [S]$) [12]. To test this hypothesis, we obtained equilibrium binding constants for Cerberus-Fc – BMP-4 (Fig. 4A), we generated IC_{50} values for inhibition of BMP-4 – Cerberus-Fc binding by Cerberus using both RU and rate constant based approaches (Fig. 4B and C), and we compared experimental with calculated IC_{50} values (Tables 1 and 2). The theoretical IC_{50} value for the Cerberus – BMP-4 –

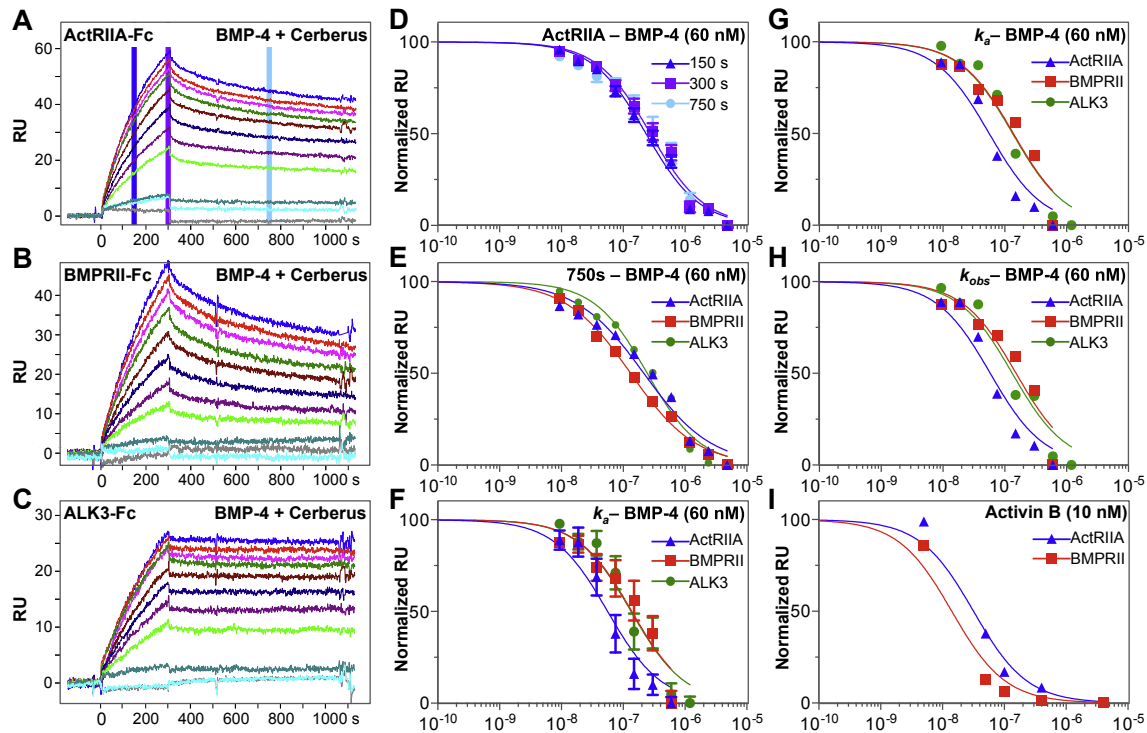


Fig. 3. Inhibition of BMP-4 – receptor binding with Cerberus. (A) ActRIIA-Fc was captured on the sensor chip. (B) BMPRII-Fc was captured on the sensor chip. (C) ALK3-Fc was captured on the sensor chip. (A–C) In the three experiments, 60 nM BMP-4 was preincubated with 0 nM (blue), 9.375 nM (red), 18.75 nM (magenta), 37.5 nM (green), 75.0 nM (maroon), 150.0 nM (dark blue), 300.0 nM (purple), 600.0 nM (bright green), 1200.0 nM (teal), 2400.0 nM (cyan), and 4800.0 nM (grey) Fc free Cerberus. Cerberus – BMP-4 mixtures were injected over the sensor chip. (D) Analysis of SPR RU ActRIIA-Fc data (2A). Background subtracted raw RU values were taken for each Cerberus concentration at 150 s (blue), 300 s (purple) and 750 s (cyan) following injection of BMP-4 mixtures. RU values for each concentration group were normalized and fitted using the non-linear regression algorithm implemented in GraphPad. Standard errors (SEs) are shown. (E) Analysis of SPR RU data for ActRIIA-Fc (blue, from 2A), BMPRII-Fc (red, from 2B) and ALK3-Fc (green, from 2C). Background subtracted RU values were taken for each Cerberus concentration at 750 s of the SPR reaction. RU values for each group were normalized and fitted using non-linear regression in GraphPad. SEs are similar to those observed for ActRIIA-Fc inhibition in D, but are omitted here for clarity. (F) Analysis of k_a data for ActRIIA-Fc (blue, from 2A), BMPRII-Fc (red, from 2B) and ALK3-Fc (green, from 2C). k_a values were obtained by individually fitting each injection curve. k_a values were normalized and fitted using non-linear regression in GraphPad. SEs are shown. (G) Same data as F, but Standard errors are omitted for clarity. (H) Analysis of k_{obs} data for ActRIIA-Fc (blue, from 2A), BMPRII-Fc (red, from 2B) and ALK3-Fc (green, from 2C). k_{obs} values were obtained by individually fitting each injection curve. k_{obs} values were normalized and fitted using non-linear regression in GraphPad. SEs are similar to those observed for k_a analysis in F, but are omitted here for clarity. (I) Cerberus prevents Activin B binding to type II receptors. SPR Background subtracted RU values were taken for each Cerberus concentration at 750 s of the SPR reaction for ActRIIA-Fc (blue) and BMPRII-Fc (red). RU values for each group were normalized and fitted using non-linear regression in GraphPad. Concentrations in panels D–I are shown in logarithmic scale. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

Cerberus reaction is 62.73 nM ([BMP-4] = 60 nM, K_d for Cerberus – BMP-4 binding = 2.73 nM) [12]. Experimental IC_{50} values calculated using RU were 56.7 ± 3.3 at 150 s, 57.6 ± 3.3 at 300 s, and 46.6 ± 3.0 at 750 s. Experimental IC_{50} values calculated using rate constants were 99.7 ± 21 (for k_a) and 99.7 ± 21 (for k_{obs}). Comparison of theoretical and experimental IC_{50} values indicates the most accurate experimental IC_{50} values are obtained using the simple, RU based approach (Table 2). Moreover, IC_{50} values obtained using RU data from the association phase match the theoretical value more closely. Together with our findings above (Fig. 3D and E), these experiments indicate RU values from the middle of the association phase offer the most consistent and accurate results. Nonetheless, all approaches gave IC_{50} values that were within reasonable range of the theoretical IC_{50} value (less than 2-fold difference), demonstrating the overall reliability of biosensor-based IC_{50} determinations.

Comparing SPR based IC_{50} with whole cell IC_{50}

To evaluate IC_{50} values obtained with SPR in relation to IC_{50} values obtained using a whole cell system, we determined the half-maximal inhibitory concentration of Cerberus for BMP-4 using a luciferase reporter gene expression assay (Fig. 4D). Briefly, we

transfected HepG2 cells with control plasmid pGL4.74 [hRLuc] and the SMAD1/5/8 responsive reporter plasmid pGL3 [luc2P/BRE]. Transfected HepG2 cells were treated with 1 nM BMP-4 and different concentrations of Cerberus-Fc. BMP-4 induced luciferase expression with the SMAD1/5/8 reporter, and Cer-Fc inhibited BMP-4 signaling in a concentration dependent manner (Fig. 4D). Using relative luciferase response unit (RLU) and GraphPad, we obtained an IC_{50} value of 26 nM for inhibition.

Overall, IC_{50} values obtained using a whole cell system are in agreement with, but not identical to IC_{50} values determined by SPR (Figs. 3 and 4, Table 2). There are several reasons for the observed differences, and they relate to the complexity of the BMP-4 signaling pathway. First, the amount of BMP-4 used in the two experimental formats is different, 60 nM for the SPR experiment versus 1 nM for the reporter assay. Thus, in this particular SPR setup a higher concentration of inhibitor is needed. Second, the molar equivalent of captured receptor on the sensor chip is in all likelihood different from the molar equivalent of receptor found on the cell surface. Lastly, IC_{50} determined with SPR is specific to individual receptors. By contrast, IC_{50} determined using a whole cell system combines the contributions of several receptors and other co-receptors expressed on the cell surface. Which receptor or co-receptor is dominant depends on expression levels, and on the

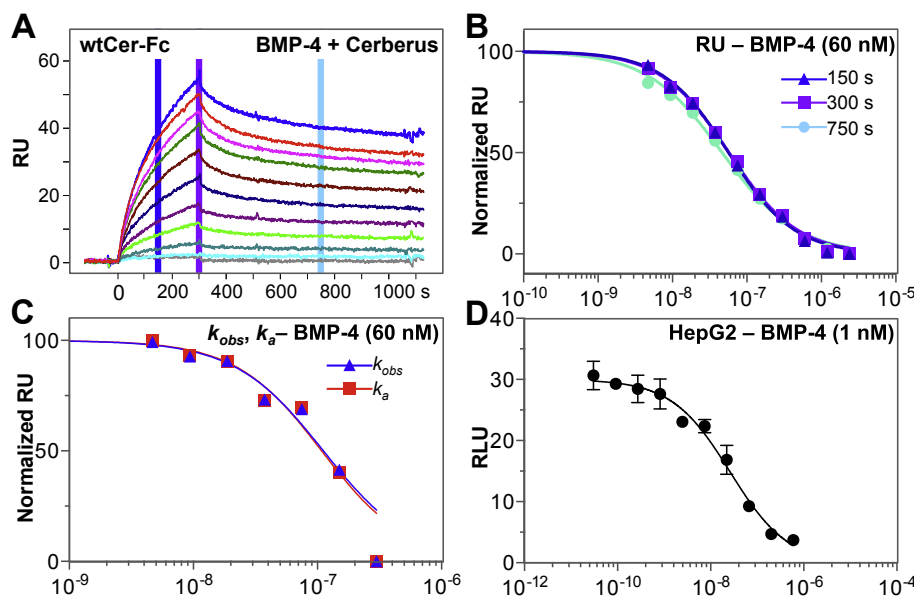


Fig. 4. Inhibition of BMP-4 – Cerberus binding with Cerberus. **(A)** Cerberus prevents BMP-4 – Cerberus-Fc binding. Cer-Fc was captured on the sensor chip and 60 nM BMP-4 preincubated with 0 nM (blue), 4.6875 nM (red), 9.375 nM (magenta), 18.75 nM (green), 37.5 nM (maroon), 75.0 nM (dark blue), 150.0 nM (purple), 300.0 nM (bright green), 600.0 nM (teal), 1200.0 nM (cyan), and 2400.0 nM (grey). Fc free Cerberus was injected over the sensor chip. **(B)** Background subtracted raw RU values were taken for each Cerberus concentration at 150 s (blue), 300 s (purple) and 750 s (cyan). RU values for each group were normalized and fitted using non-linear regression in GraphPad. SEs are similar to those observed for ActRIIA–Fc inhibition in 2D, but are omitted here for clarity. **(C)** Analysis of k_{obs} (blue) and k_a (red) data for Cerberus-Fc. k_{obs} and k_a values were obtained by individually fitting each injection curve. k_{obs} and k_a values were normalized and fitted using non-linear regression in GraphPad. SEs are similar to those observed for k_a analysis in 2F, but are omitted here for clarity. **(D)** BMP-4 mediated Smad1/5/8 signaling and inhibition with Cerberus. HepG2 cells were transfected with SMAD1/5/8 responsive reporter and control plasmids. Cells were treated with 1.0 nM BMP-4, and Cer-Fc at the following concentrations: 0.0 nM, 0.03 nM, 0.09 nM, 0.27 nM, 0.82 nM, 2.47 nM, 7.41 nM, 22.2 nM, 66.6 nM, 200 nM, and 600 nM. Concentrations in panels B–D are shown in logarithmic scale. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

exact combination of interacting components expressed by the experimental cell line selected for the assay. However resolving these questions is likely not possible for most experimental cell lines. In spite of these differences, our findings demonstrate **1)** IC_{50} values for inhibition of specific interactions can be obtained using SPR, **2)** these IC_{50} values offer inhibitory information that complements inhibition data obtained using whole cell systems, and **3)** inhibitory mechanisms and specific potency of inhibitor variants can be investigated using SPR based inhibition analysis, but not using cell lines.

Adapting SPR based IC_{50} determination to other experimental systems

Here we have demonstrated using the TGF- β family ligand BMP-4, its receptors and the inhibitor Cerberus how to use SPR to elucidate the mechanism of action of a competitive inhibitor and to obtain inhibitory potency information using simple RU responses. Notably, this approach can be used to analyze any system where the goal is to prevent a particular interaction. The inhibitor can be large, such as an antibody or a natural polypeptide antagonist, or it can also be a small molecule. But several criteria must be met for this system to work. As is typical for SPR, both ‘Ligand’-capture and surface-regeneration must be highly reproducible. This point cannot be emphasized enough. More specifically for IC_{50} determination, the interaction geometry must be such that the inhibitor prevents ‘analyte’ binding to the captured ‘ligand’, and thus causes a reduction in the SPR signal. Importantly, the ‘inhibitor’ must not interact with the biosensor surface. Any example that meets these criteria can be analyzed using this approach.

Conclusions

Our findings show SPR can be used to obtain robust and quantitative functional data for an inhibitor and potential pharmacologic agent. The SPR based approach is especially useful when examining targets with complex biochemistry, such as cytokines or growth factors that interact with multiple receptors and co-receptors. In a best approximation response unit (RU) values from an inhibition reaction can be taken directly to evaluate inhibitory potency. The association phase likely provides the most accurate IC_{50} values. When established, SPR based IC_{50} determination allows for a simple and high-throughput comparison of the molecular properties of variants.

Conflict of interests

The authors declare no competing interests.

Author contributions

SA and EMH designed experiments. SA performed experiments. SA and EMH interpreted experiments. EMH wrote manuscript. SA and EMH revised manuscript.

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