

# De novo design of protein binders as functional therapeutics

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A dissertation

submitted in partial fulfillment of the  
requirements for the degree of

Doctor of Philosophy

University of Washington

2023

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Program Authorized to Offer Degree:

Bioengineering

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**Abstract**

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De novo design of protein binding proteins (minibinders) with target structure information alone remains a grand challenge. A general computational design framework includes (1) generation of binder backbones, (2) sequence design and side-chain refinement, (3) resampling, and (4) prediction of binding and evaluation of the minibinders as a monomer. In Chapter 1, I review the improved computational minibinder design method I have contributed to develop. With these cutting-edge pipelines, I describe two strategies of applying designed minibinders as novel functional therapeutics: in Chapter 2, I report the design of minibinder antagonists as immune

modulator for cytokine storm; in Chapter 3, I report the design of endocytosis ligands for target degradation and signaling amplification. Overall, the minibinder is a brand-new drug modality/platform with advantages of ultra-stability, high-specificity, robust production, and modularity. The work described indicate the great potential of the minibinder to bridge the gap of existing therapeutics and revolutionize the future of protein drug development.

## ACKNOWLEDGEMENTS

I would like to thank my advisor David Baker for his guidance and advice throughout my PhD. I sincerely appreciate the freedom and support he gave me, allowing me to explore a variety of areas including PPI, protein degradation and neurodegenerative diseases. I am grateful for his commitment of time and effort in supervising me. I am especially thankful for his encouragement and coordination during my tough period and his relentless effort to make IPD such a perfect place for idealists to show off their creativity. I also acknowledge David for drinking up my Moutai.

I would like to acknowledge the mentorship from my two amazing mentors: Longxing Cao and Brian Coventry for guiding me through the area of protein interface design. My programming skills and instinct for binder design all came from their selfless advice. I want to thank my colleague Mohamad Abedi for being a great friend and collaborator for the EndoTag projects we worked on together. I am super grateful for his support in cell assays when no infrastructure is built in lab back in 2021. I acknowledge my friend and cohort colleague Nate Bennett for being a great teammate for most of my PPI work. I want to thank all IPD members for their effort to make such a fantastic place to live and work, including Xinru Wang, Marc Exposit, Wei Yang, Shunzhi Wang, Thomas Schlichthaerle, Inna Goreshnik, Ching Chiu, Basile Wicky, Jason Zhang, Matthias Gloegl, David Lee, Pat Erickson, Lisa Brandenburg, Justas Dauparas, Rob Ragotte, Susana Vazquez Torres, Preetham Venkatesh, Lucks Miles, Shunzhi Wang, Danny Satoe, Hojun Choi, Hannah Han, Joe Watson, Andy Yeh, Paul Levine, Lauren Carter, Sidney Chan, Maggie Ahlrichs, Dionne Vafeados, Samer F. Halabiya, Aza Allen, Cami Cordray and more.

I want to thank my parents for providing all kinds of support and help for me. It is their 100% encouragement that keeps me persist in the way in exploring science without worrying about any other issues. I want to thank my girlfriend Yuyang for providing all emotional support for me. When things didn't work out, she is always there and ready to identify the flaws/mistakes and cheer me up.

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# Chapter 1. DESIGN OF PROTEIN BINDING PROTEINS FROM STRUCTURE INFORMATION ALONE

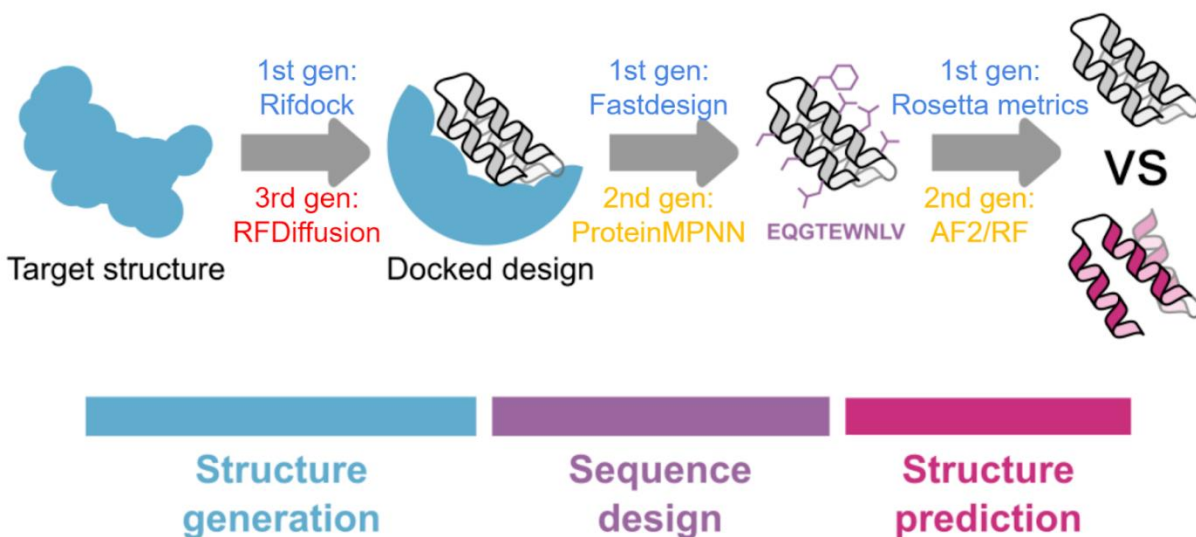
## **ABSTRACT**

Protein-protein interactions are crucial for native biological function in organisms as well as therapeutic development. Current drug development mostly relies on empirical screening or library-wise screening, yet targeting a specific region of a given protein is not easily accessible. Grafting or scaffolding on a motif/fragment of a known binding protein provides a feasible solution, but the dependency on the existing binding protein limits its broad application and restricts the sampling space hence the affinity. To solve this problem, we developed a brand-new **fully de novo** computational binder design pipeline that can generate high-affinity binders (referred to as miniproteins) totally from scratch with the structure information alone. We further optimize this method by incorporating deep-learning based protein design software that significantly improves the successful rate and sampling efficiency. The precise control of binding epitope of the miniprotein platform enables its potential as novel therapeutics and diagnostic tools.

## MAIN TEXT

The fully de novo pipeline against any arbitrary epitope of an arbitrary target includes the following steps (**Fig. 1**):

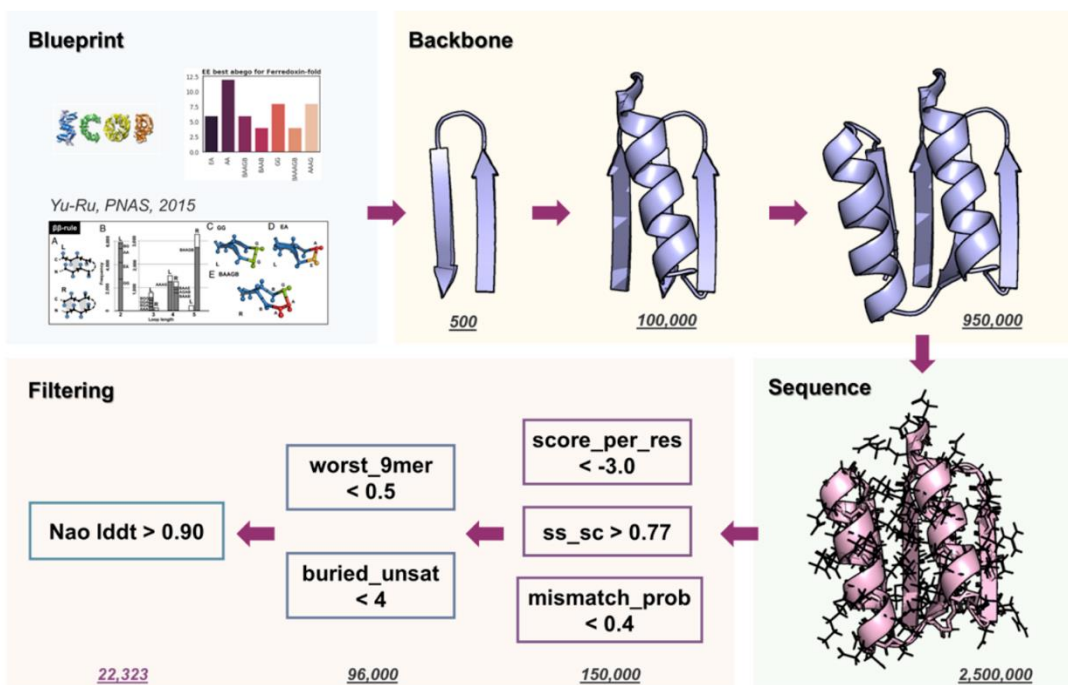
1. Backbone generation: Generate a diverse set of backbone (main chain) that has a complementary shape against the selected target epitope/hotspot. In this step, the placement of the dock and overall folding of the backbone is essential.
2. Sequence design: Assign the amino acid sequences of the dock based on the backbone placement generated from step1 followed by refinement of the side chain.
3. Scoring: Use computational metrics to determine whether a designed dock fulfill monomer properties (folding, hydrophobicity, net charge, etc) and binder properties (shape complemenrarity, binding energy, buried surface area, etc)



**Figure 1.** General fully de novo protein binder pipeline.

## 1.1 1ST GENERATION PIPELINE CAO 2021

Scaffold generation: As the 1st generation pipeline, this method is fully based on Rosetta Software package + patchdock<sup>1</sup>. The method aims to generate backbones starting from a pre-made scaffold library, where it includes 55-65 AA de novo designed protein (miniprotein) with various shapes and topologies<sup>2</sup>. We initialized a large scaffold design campaign to explore all possible topologies, where my work involves the generation of a ferredoxin-like scaffold set using Rosetta Blueprint builder<sup>3,4</sup> (**Fig. 2**). The ferredoxin-like fold is a topology of protein composed of EHEEHE (E stands for strand, H stands for helix). To make a de novo set of such topology, I first extracted all native ferredoxin-like fold from SCOP database<sup>5</sup>, analyzed and summarized the most common secondary-structure types and ABEGO<sup>3</sup> types of ferredoxin-like fold. Then I modified the standard Rosetta Blueprint builder which ended up with low successful rate, and applied a piecewise Blueprint assembly to build a whole ferredoxin-like fold with 3 steps. After sequence design and optimization with Rosetta Fastdesign, I was able to generate 1 million candidates. With further filtering with Rosetta monomer metrics including score\_per\_res, ss\_sc, mismatch\_prob, and worst\_9\_mer, I was able to obtain 22,000 designs with confident folding and monomer metrics.

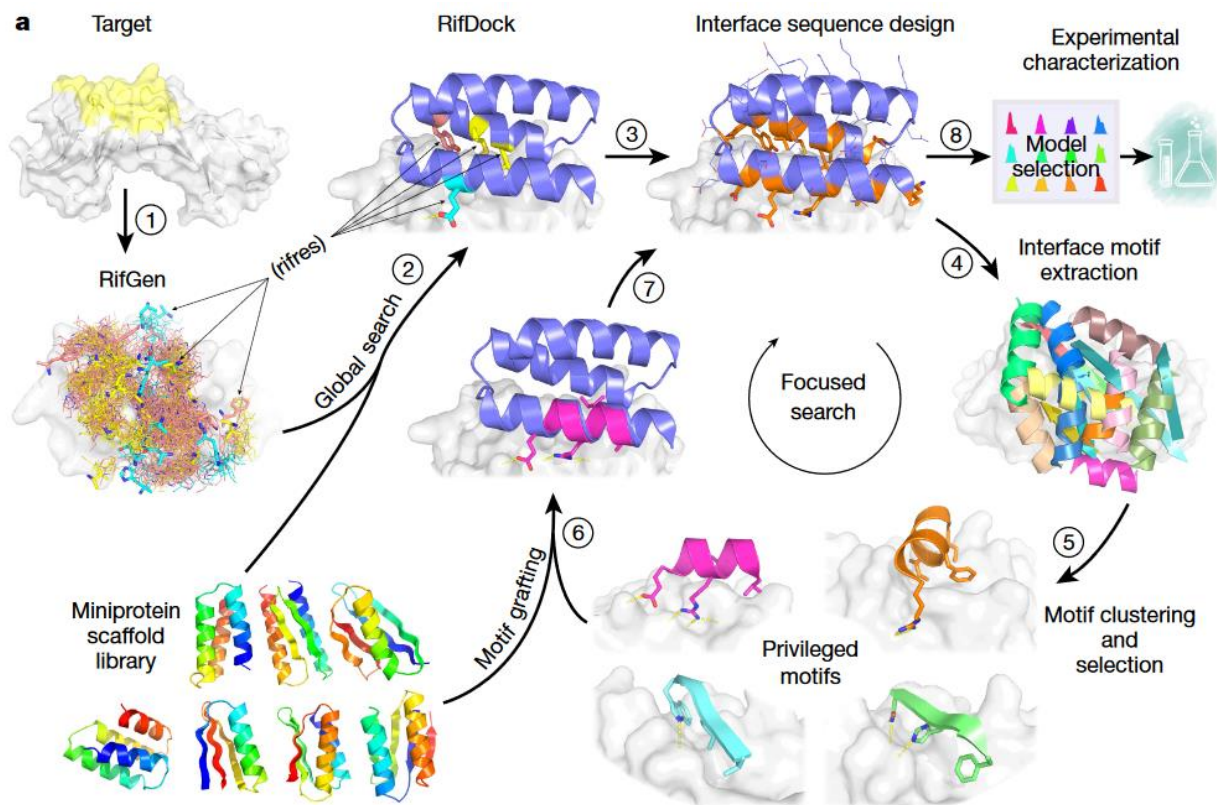


**Figure 2.** Design of Ferredoxin-like scaffold set using piecewise Rosetta Blueprint builder

Backbone generation: With the scaffold set ready, we commence the full protocol described in **(Fig. 3)**<sup>1</sup>. Beginning with a crystal structure of a target we would like to make binders against and with a certain number of residue patches we selected as the epitope, we input the scaffold set and apply the rigid patchdock to find all potential placements of a given scaffold in the set<sup>6</sup>. Given the rough placement of the backbones, we then applied Rosetta Rifdock to search for inverse rotamers that favor binding and globally search for the backbones that can fit as many good rotamers as possible based on an internal score function. After patchdock + rifdock, we will usually get 5~10 million backbones.

Sequence design: After backbone generation, we then assign the sequence to the backbones with a modified Rosetta Fastdesign<sup>7</sup>. The rotamer of the assigned sequence will then be relaxed/refined with Rosetta Fastrelax to pack the side chains. The Fastdesign and Fastrelax cycle is the leading cost step for computation, therefore, we run a quick predictor to predict raw metrics and pre-filter on the backbones. Using this approach, we could downsample the 5~10 million backbones to 0.5~1 million, which largely improve our computational efficiency.

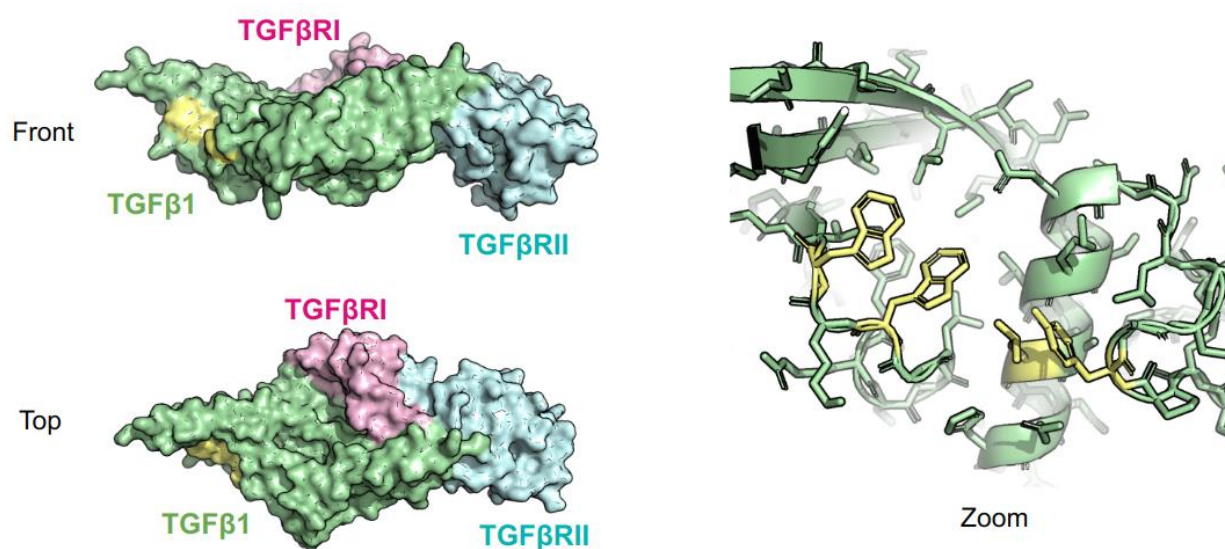
Scoring: After sequence designing with Rosetta Fastdesign, we then rely on the Rosetta metrics generated to further finalize the ordering pools for experimental validation. We filter candidates based on both the monomer properties and interface properties. For the monomer properties, we mainly evaluate the quality of the fragments (worst\_9mer and mismatch\_prob), folding confidence (ss\_sc), net charge and hydrophobicity. For the interface properties, we rely on the interface\_buried\_sasa (solvent buried surface area), contact\_molecular\_surface (shape complementarity and distance) and ddg (binding energy).



**Figure 3. Overview of the 1st generation binder design pipeline.**

Figure is adapted from Cao, L., Coventry, B., Goreshnik, I., Huang, B., Sheffler, W., Park, J. S., ... & Baker, D. (2022). Design of protein-binding proteins from the target structure alone

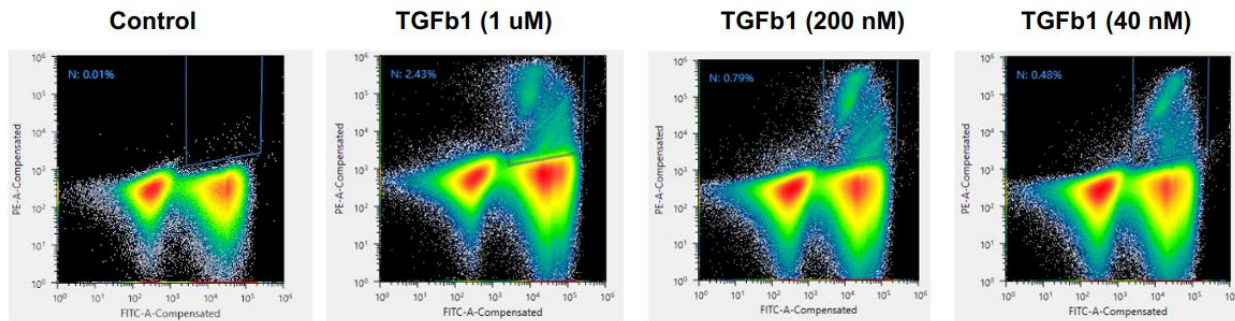
As an application of the miniprotein binders, I designed miniprotein binder against TGF $\beta$ 1, which is a versatile cytokine controlling tissue growth and immune modulation<sup>8</sup>. A neutralization binder of TGF $\beta$ 1 will function as an immune checkpoint inhibitor to recover the immune activation against cancer. Based on the complex structure of TGF $\beta$ 1 in complex with TGF $\beta$ R1 and TGF $\beta$ R2 (PDB 3KFD), TGF $\beta$ 1 is a homodimer can binds to two molecules of TGF $\beta$ R1 and TGF $\beta$ R2 as a ternary complex. To design miniprotein binder, I selected the 3 hydrophobic residues at the intersection of TGF $\beta$ R1 and TGF $\beta$ R2 binding site (**Fig. 4**), then ran through the patchdock and Rifdock backbone generation followed by Fastdesign and filtering.



**Figure 4. Overview of miniprotein binder design against TGF $\beta$ 1.**

The structure is based on PDB 3KFD. The hotspot residues in TGF $\beta$ 1 selected for binding pocket is highlighted in yellow.

After filtering the rosetta metrics, I selected the top 15,000 designs for experimental validation. To screen binding affinity, I applied yeast display followed by next-generation sequencing. In yeast display (**Fig. 5**).



**Figure 5. Yeast display screening of miniprotein binder library against TGFb1.**

After obtaining the sequence from NGS, we then further optimized the binding affinity with another round of mutation library followed by combinational mutation library. The top candidates were then expressed in E coli and its binding affinity was 113nM determined by BLI<sup>1</sup>

## 1.2 2ND GENERATION PIPELINE BENNET 2023

To address the low successful rate and expensive sampling issues, we then came out with an updated protocol based on the framework of 2021 Cao protocol after protein structure prediction models alphafold2<sup>9</sup> and RosettaFold<sup>10</sup> emerged, where the protocol contains two major modification: 1. We replaced the speed-limit Rosetta Fastdesign with ProteinMPNN<sup>11</sup>, which is a fine-tuned Graph-neural-network developed to predict sequences based on a backbone. The ProteinMPNN improves the design successful rate with much less computational computation than Rosetta Fastdesign; 2. We added Alphafold2 prediction as an orthogonal scoring metrics in alternative to existing Rosetta based metrics, in order to filter candidates to test experimentally. The Alphafold2 pae\_interaction is proved to be the best metric in discriminating binder vs non-binders<sup>12</sup>.

## 1.3 3RD GENERATION PIPELINE RFDIFFUSION

Right after 2nd generation pipeline, we reported the game-changing RFDiffusion, which improved our binder design successful rate from 0.1% to 10%. All other elements in the pipeline is exactly the same, the only difference is we replace the Rfdock-based backbone generation step with RFDiffusion. The major difference is that we don't rely on pre-designed scaffold set anymore. Instead, RFDiffusion will generate customized binder scaffolds against the target considering the hotspot information. Compared to pre-designed scaffold, this customized binders have significantly improved shape complementarity against the epitopes selected on the target structure.

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## Chapter 2. DE NOVO DESIGN OF MINIPROTEIN ANTAGONISTS OF CYTOKINE STORM INDUCERS

Adapted from *Buwei Huang<sup>1,2,3†</sup>, Brian Coventry<sup>1,2,4†</sup>, Marta T. Borowska<sup>5†</sup>, Dimitrios C. Arhontoulis<sup>6†</sup>, Kevin M. Jude<sup>5,7</sup>, Mohamad Abedi<sup>1,2</sup>, Samer F. Halabiya<sup>2</sup>, Aza Allen<sup>2</sup>, Cami Cordray<sup>2</sup>, Inna Goreschnik<sup>1,2,4</sup>, Maggie Ahlrichs<sup>2</sup>, Sidney Chan<sup>2</sup>, Hillary Tunggal<sup>7</sup>, Michelle DeWitt<sup>2</sup>, Lauren Carter<sup>2</sup>, Lance Stewart<sup>2</sup>, Deborah H. Fuller<sup>7</sup>, Ying Mei<sup>6</sup>, K. Christopher Garcia<sup>5,7,9</sup>, David Baker<sup>1,2,5</sup>. Unpublished. De novo design of miniprotein antagonists of cytokine storm inducers.*

### **ABSTRACT**

Cytokine release syndrome (CRS), also known as cytokine storm, is a global health threat enrolled in multiple autoimmune diseases and viral infectious diseases. Interleukin-6 (IL-6) and interleukin-1 (IL-1) are two major pro-inflammatory cytokines involved in the CRS process and have been identified as crucial therapeutic targets for these diseases. Existing antagonists against IL-6R/IL-1R such as tocilizumab and anakinra are systematic anti-inflammation drugs, that are less favorable for acute diseases requiring short-term or local treatment. Here we describe the development of de novo-designed antagonists against receptors controlling IL-6 and IL-1 $\beta$  signaling, including IL-6R, GP130 and IL-1R1, with picomolar to sub-nanomolar binding affinity. The antagonists neutralize IL-6 and IL-1 $\beta$  signaling by binding to the corresponding receptors and blocking interaction with the cognate cytokines. X-ray crystal structures of the antagonists are very close to the computational design models.

In a human cardiac organoid disease model, the IL-1R antagonists show efficient protection against inflammation and cardiac damage caused by IL-1 $\beta$  stimulus. These minibinders are attractive candidates for administration via subcutaneous injection or intranasal / inhaled application to block acute cytokine storm.

## INTRODUCTION

Cytokine release syndrome is an acute systemic inflammatory syndrome involving the overproduction of proinflammatory cytokines and remains a global health threat<sup>1</sup>. CRS can be triggered by various diseases and therapeutic interventions including autoimmune diseases, CAR-T therapy, and antibody treatment, and also prompted by viral infections as occurred during the outbreak of SARS-COV-2, influenza and MERS infections<sup>2,3</sup>. IL-6 and IL-1 $\beta$  are potent proinflammatory cytokines controlling the adaptive and innate immune response<sup>4</sup> (**Fig. 1**), but in the CRS context, the overproduction of IL-6 and IL-1 $\beta$  can cause devastating effects by excessively activating immune cells and reinforcing the cytokine production cycle<sup>5,7</sup>, leading to severe tissue damage and injury. During serious viral infection in the lung, elevated levels of IL-6 and IL-1 $\beta$  result in overactivation and excessive recruitment of neutrophils and macrophages, damaging the alveolar epithelial cells, which can cause tissue injury and respiratory failure associated with acute respiratory distress syndrome (ARDS)<sup>8</sup>.

Antagonists of IL-6 and IL-1 $\beta$  signaling have been broadly used to treat long-term systematic autoimmune diseases such as Rheumatoid Arthritis (RA), but it is unclear whether systematic inhibition of IL-6 and IL-1 $\beta$  signaling will benefit patients with acute CRS due to viral infection or therapeutic interventions. Neither the IL-6R inhibitor Tocilizumab or the IL-1R inhibitor Anakinra significantly improved the survival of critical SARS-COV-2 patients<sup>9-12</sup>. Administering long-circulating immunomodulation drugs to severe or critical patients also can increase the risk of pathogen infection<sup>10,11</sup>. Therefore, alternative therapeutic strategies providing local and short-term immunomodulation in the lung to deal with acute ARDS while avoiding longer term immune suppression are needed<sup>10,13</sup>.

De novo minibinders are computationally designed proteins with high affinity for their targets and hyperthermostability. We previously developed minibinder proteins that efficiently block the SARS-CoV-2 receptor binding domain (RBD) and protect animals from viral infection when introduced intranasally<sup>14</sup>, and that inhibits signaling through the IL-7 cytokine receptor<sup>15</sup>. We reasoned that de novo-designed minibinders at the ligand binding sites of the IL-6 receptor and the IL-1 receptor would result in effective antagonists against viral-induced CRS that could be compatible with intranasal / inhaled application for short-term immunomodulation.

## 2.1 DESIGN OF CYTOKINE RECEPTOR ANTAGONISTS

IL6 signals by bringing together the IL6-specific IL-6R receptor subunit with the shared GP130 receptor subunit in a higher-order complex<sup>16</sup>, while IL-1 signals by bringing together the IL-1R subunit with IL-1R accessory protein (IL-1RAP)<sup>17</sup>. To computationally design antagonists that block binding to IL-6R, GP120, and IL-1R, we focused on the native ligand binding site for each receptor in the experimentally determined structures (PDB: 1N26, 1P9M and 1IRA). From these crystal structures, several hydrophobic residues in the native ligand binding site were selected. A rotamer interaction field was generated around this site with the RIF docking software<sup>18</sup> and a miniprotein scaffold library was rigidly docked to the selected target residues using Patchdock<sup>19</sup>, followed by a local search using Riffdock<sup>15</sup>. The sequence and the structure of the initial docks were optimized with RosettaFastdesign<sup>15</sup> followed by one round of diversification through RosettaMotifgraft<sup>20</sup> and further optimization with RosettaFastdesign. The combined output designs from both rounds were further filtered with Rosetta metrics including `ddg`, `contact_patch`, `ss_sc`, `worst9mer`, `mismatch_prob`, `contact_molecular_surface`, and `sap score`<sup>15</sup>. For each target, the top

100,000 candidates passing all Rosetta filters were chosen as the final pool for experimental screening.

## 2.2 EXPERIMENTAL SCREENING AND CHARACTERIZATION OF THE DESIGNED MINIBINDERS

Oligonucleotides encoding the amino acid sequences were transformed into yeast and screened against the corresponding target protein using yeast surface display using fluorescence-activated cell sorting (FACS) followed by next-generation sequencing (NGS)<sup>15,21</sup>. The enrichment for each minibinder was calculated and the binding affinity  $K_D$  was estimated based on the relative enrichment at different target concentrations. We set a threshold of  $K_D < 10 \mu\text{M}$  measured in this way as a successful hit and identified 1016 initial hits for IL-6R, 914 initial hits for GP130 and 216 initial hits for IL-1R.

We next sought to optimize the binding affinity and validate the binding mode for the top 50 initial hits for each target with an additional round of site saturation mutagenesis (SSM) library selection, where each residue in a designed binder was mutated to each of the other 19 amino acid types one at a time. After sorting the new SSM libraries against the corresponding target using FACS and NGS, we estimated the  $K_D$  and calculated the relative enrichment for each single mutant over the  $K_D$  of its parent sequence. We selected designs with SSM maps (**Ext Data Fig. 1**) consistent with the computational design model (conservation at the designed binding site and in the protein core) and further optimized their affinity with another round of combinatorial library (combining the most enriched substitutions in the SSM) screening using FACS followed by NGS.

We next expressed the optimized designs for each target in E coli and purified the proteins with Immobilized Metal Chelate Chromatography (IMAC) followed by Size Exclusion Chromatography (SEC). The binding affinities of the purified minibinders were estimated by biolayer interferometry (BLI) against the biotinylated target protein. The top candidates for IL-6R (IL-6Rmb6 and IL-6Rmb10) both bound IL-6R at 300 pM KD (**Fig. 2c**); the best binding affinity binder for GP130 (GP130mb33) bound GP130 at 2.8 nM KD (**Fig. 2g**); and designs IL-1Rmb80 and IL-1Rmb81 bound to IL-1R1 at 3.0nM and 3.2nM, respectively (**Fig. 2k**). All the designs were very thermal stable, with similar circular dichroism (CD) traces before and after heating to 95 °C (**Fig. 2d, Fig. 2h, Fig. 2l**).

### 2.3 MINIBINDERS FUNCTION AS POTENT ANTAGONISTS

Next we investigated the capability of the designed binder to inhibit the signaling of the corresponding cytokines. For the IL-6 signaling pathway, we used a phosphoflow assay to evaluate the intracellular signaling pathway STAT3. In the assay, the designed IL-6R binders (IL-6Rmb6 and IL-6Rmb10) both function as potent IL-6 competitors in human THP-1 cells, where 100 nM IL-6Rmb6 led to 2900 fold increase and 100nM IL-6Rmb10 led to 915 fold increase in EC50 of phosphorylated STAT3 activation compared to the native IL-6 (**Fig. 3a**). Similarly, the designed GP130 inhibitor GP130mb33 resulted in 48 fold increase of EC50 of IL-6 STAT3 activation (**Fig. 3b**). Additionally, the Emax of STAT3 activation decreased by 40% with the treatment of GP130 antagonists compared to IL-6 treatment alone, indicating that inhibiting the GP130 submit will not only cause a competition, but also a reduction in global STAT3 activation.

We next evaluated the IL-1 inhibition of the IL-1R antagonists by quantifying the phosphorylation of P38, which is an important component for the IL-1 activated MAPK signaling cascade. The

high-affinity candidate IL-1Rmb81 strongly reduced the activation of phosphorylated P38 in THP-1 cells triggered by 10nM of IL-1b, with an IC50 of 2.8 nM that is similar to its binding Kd to IL-1R1 (**Fig. 3c**).

## 2.4 STRUCTURE DETERMINATION

We were able to solve the crystal structures for GP130mb33 in complex with GP130. The binder bound to the designed IL-6 binding site at GP130, in nearly identical fashion to the computational design model: the Ca RMSD between design model and crystal structures are 0.33A for the monomer (**Fig. 4a**). The major binding residues close to the interface have nearly identical side-chain configurations in the crystal structure and the design model (af2 aligned). We were also able to solve the monomer structure of IL-6Rmb6, which was again very similar to the design model with RMSD=0.93A (**Fig. 4b**). The monomer structure for IL-1Rmb81 was also solved with an aligned RMSD between design and crystal structure of 0.53A (**Fig. 4c**). These results indicate the very high accuracy of our computational design approach.

## 2.5 IL-1R MINIBINDERS REDUCE DAMAGE IN hCOs:

We demonstrated the inhibition function of the IL-1R antagonists in a human cardiac organoid (hCOs) model. Previous studies have shown that IL-1b can induce inflammation in hCOs that mirror the cytokine storm caused by SARS-COV-2 infection, where the hCOs showed reduced cardiac function and pathological cardiac fibrosis after IL-1b stimulation<sup>22</sup>. In this model (**Fig. 5a**), both IL-1Rmb80 and IL-1Rmb81 reduced the cardiac damage and fibrosis caused by the IL-1b stimulation, indicated by recovered fractional area change (FAC) compared to IL-1b treatment

alone (**Fig. 5b**). The treatment of IL-1Rmb also resulted in the recovered morphologies of the hCOs compared to the IL-1b alone group (**Fig. 5c**).

We next examined the cytokine profiles in the organoids. IL-1b stimulation significantly elevated the pro-inflammatory cytokine levels including Interferon $\gamma$ , IL-6, IL-8 and IL-10, while treatment with IL-1Rmb80 and IL-1Rmb81 reduced the levels of these cytokines back to normal levels (**Fig. 5d**). Thus the inhibitors potently antagonize inflammatory responses to IL-1b in the organoid model, suggesting that they could have considerable potential in calming down the cytokine storm caused by SARS-COV-2 and other viral and environmental triggers.

## CONCLUSION

Our results highlight the power of computational protein design to create antagonists for therapeutic cell surface receptor targets. The high binding affinities, the potent neutralization of Stat signaling, and the close agreement between the crystal structures and computational design models highlight the control now afforded by computational design methodology.

The antagonists described here have considerable potential for treatment of cytokine storm—they potently block the IL1 and IL6 signaling, and their high stability and ready manufacturability should be considerable advantages. The circulation time of mini-proteins is much less than antibodies due to filtration in the kidney, and some half-life extension by pegylation, lipidation, or albumin binder fusion may be necessary, but unlike treatment of chronic disease, the treatment of acute responses like cytokine storm could benefit from shorter half-life antagonists as high doses could be administered to completely block short term responses without risk of longer-term negative effects from immunosuppression.

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FIGURES

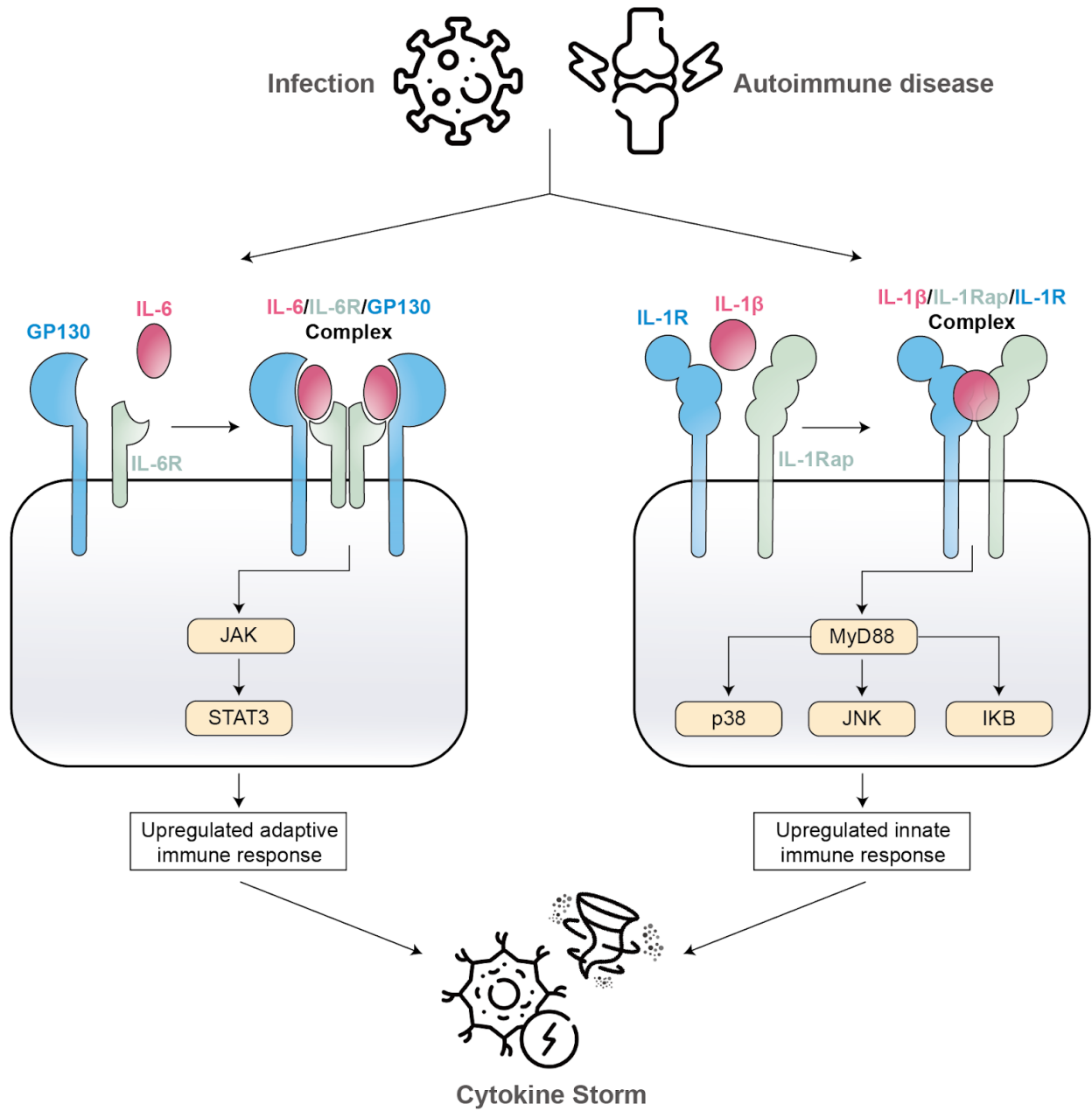
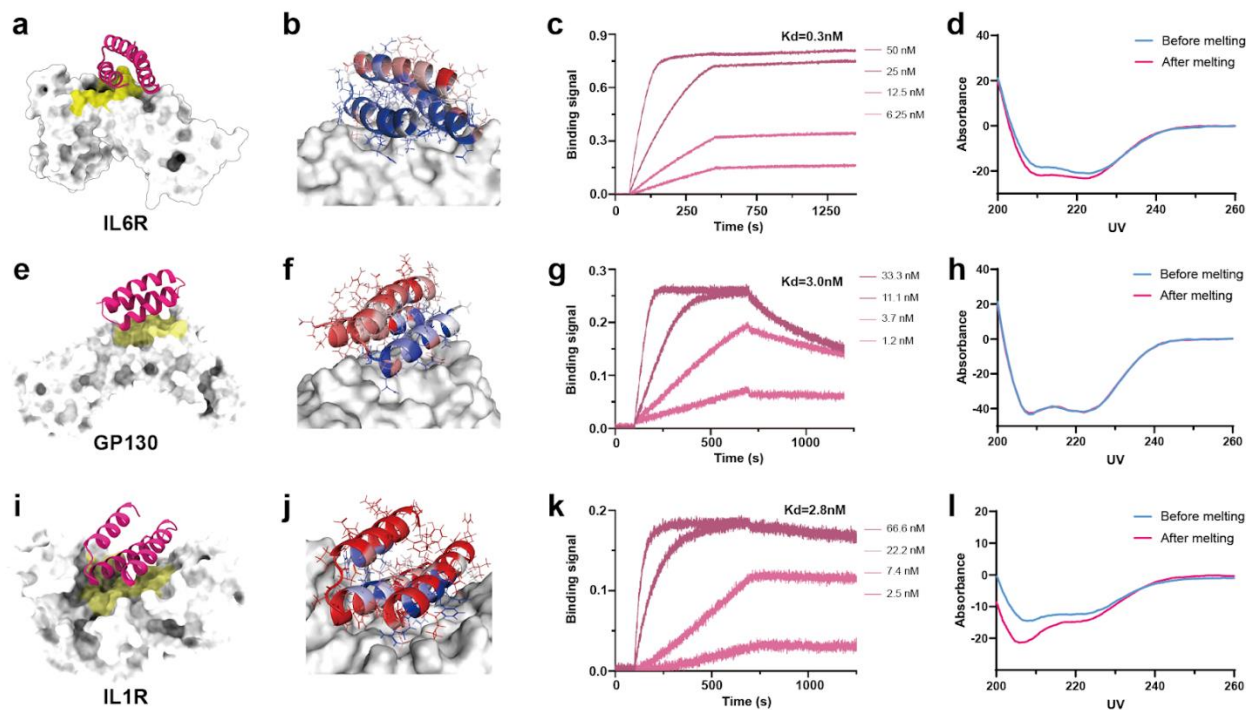
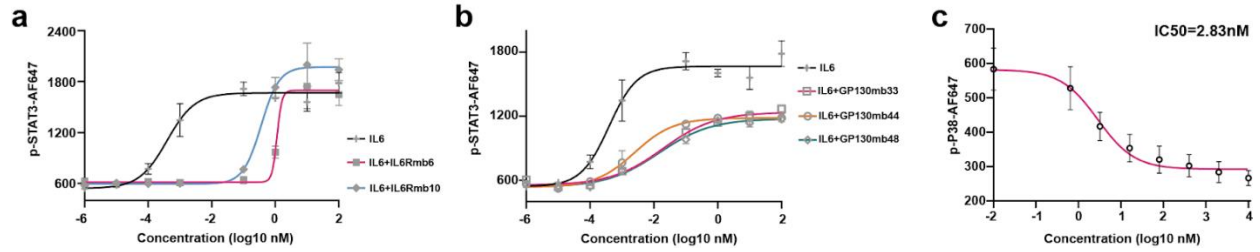


Figure 1. Signaling pathway of IL-6 and IL-1 in cytokine storm



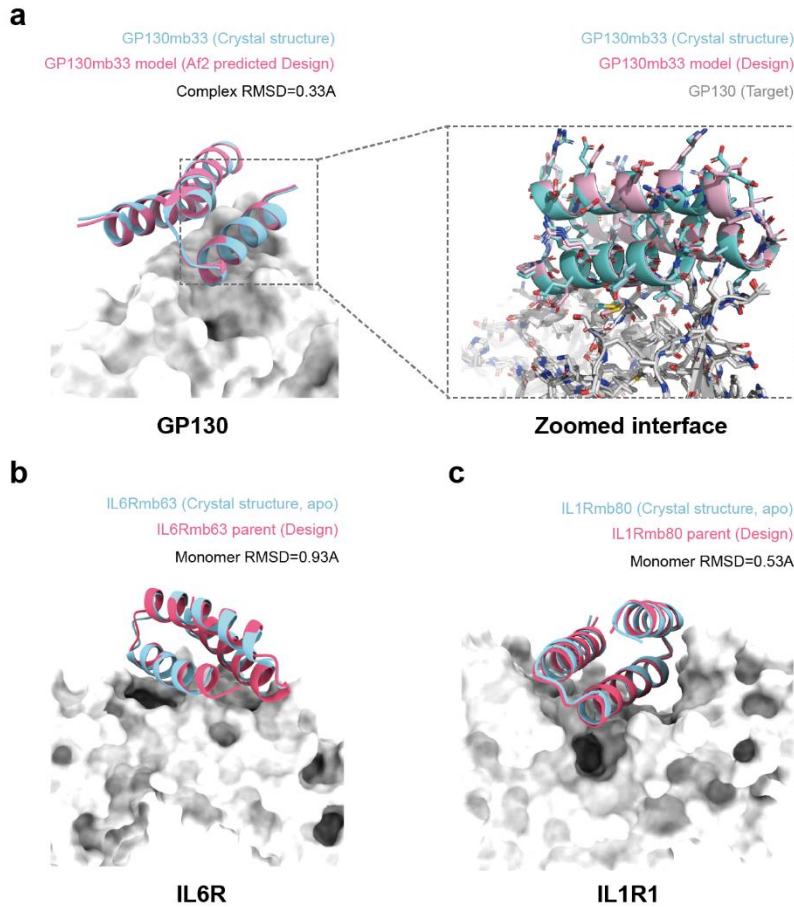
**Figure 2. Designed minibinder antagonists and characterization.**

**a,e,i**, Design model of minibinder in complex with targets. **a**: IL-6R (PDB: 1P9M, 1N26); **e**: GP130 (PDB: 1P9M); **i**: IL-1R (PDB: 1IRA). The major binding sites/hotspots were colored by yellow. **b,f,j**, Zoomed interface of initial IL-6R minibinder design model colored by conservation calculated based on site mutagenesis screening. The designed minibinders are colored based on entropy, where blue indicates the conserved position and red indicates less conserved position. **c,g,k**, Binding affinity measurement in BLI. 50nM biotinylated targets were captured in SA-tips and were incubated with given concentrations of minibinders. The binding affinity data was collected by Octet R8 and the affinity was estimated by Octet ForteBio software. **d,h,l**, Circular dichroism spectra before and after melting. The data was collected in JASCO J-1500 CD machine.



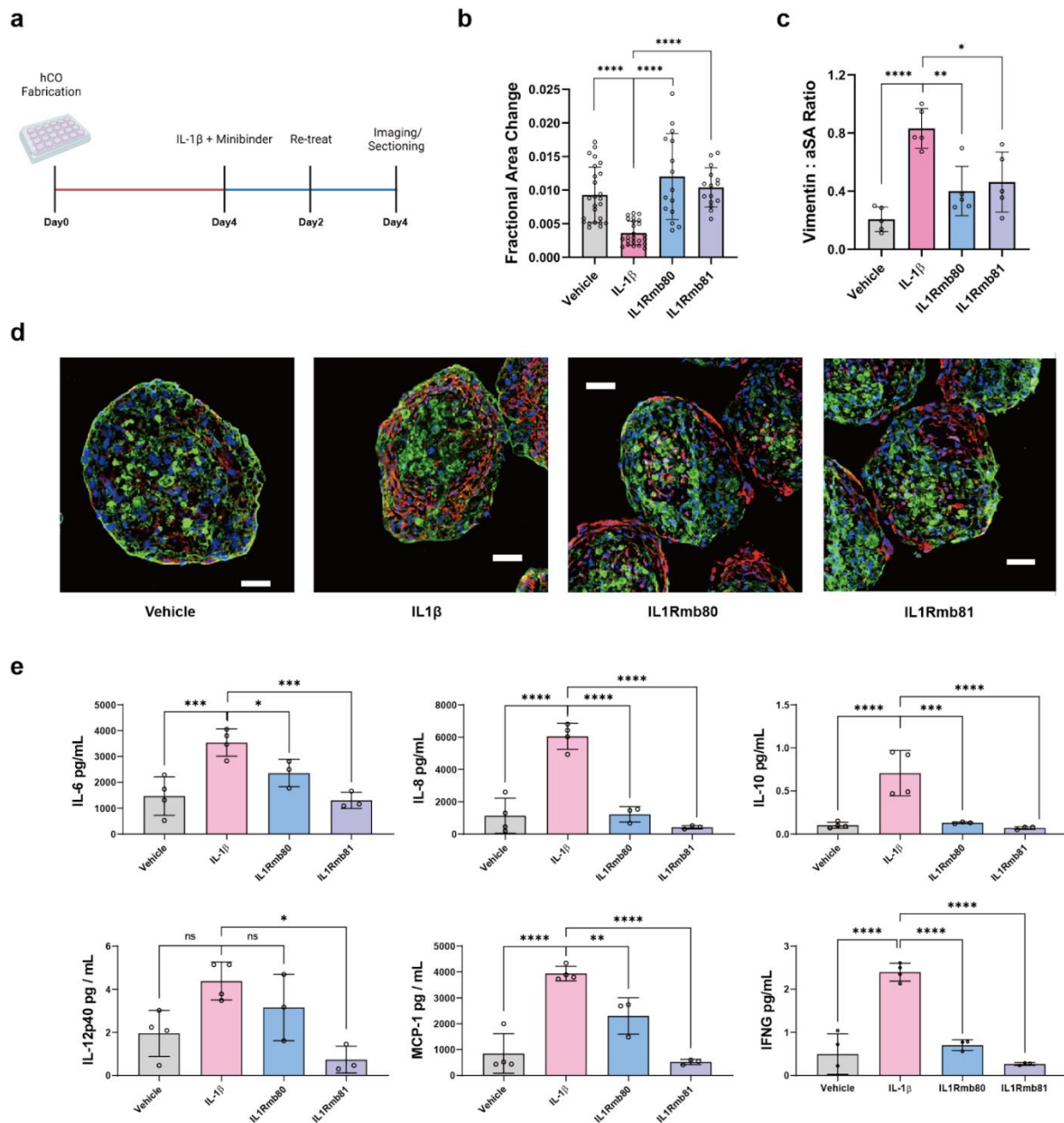
**Figure 3. Cytokine signaling inhibition effects of designed antagonists.**

**a**, Phosphorylation flow assay on STAT3 signaling. THP-1 cells were titrated with increased concentrations of IL-6 alone or with 100 nM IL-6Rmb6 or IL-6Rmb10. **b**, Phosphorylation flow assay on STAT3 signaling. THP-1 cells were titrated with increased concentrations of IL-6 alone or with 100 nM GP130 antagonists. **c**, Phosphorylation flow assay on P38 signaling. THP-1 cells were titrated with increased concentrations of IL-1Rmb81 in the presence of 10nM IL-1b. For **a,b,c**, the mean values were calculated based on the triplicates and error bars represent standard deviations. The IC50s were measured by non-lin fit using GraphPad Prism 8.0.2.



**Figure 4. Crystal structures of designed antagonists.**

**a**, Left, alignment of designed GP130mb33 in complex with GP130 with experimentally determined crystal structure. The designed GP130mb33 model is generated by running Alphafold2 prediction on the Rosetta design model. Right, zoomed interface of the aligned complex model. **b-c**, Superimposition of the experimentally solved monomer structure of designed antagonists to the designed model in complex with target. **b**, IL-6Rmb63 in complex with IL-6R. **c**, IL-1Rmb80 in complex with IL-1R.



**Figure 5. Functional study of IL-1R antagonists in human organoid model.**

**a**, Treatment regimen for injured human cardiac organoids. **b**, FAC for hCOs. **c**,  $\alpha$ -SA, Red = Vimentin. **d**, Immunofluorescent staining of hCOs (top left) or IL-1 $\beta$  stimulated hCOs (top right) on Day 4 (Green =  $\alpha$ -SA, Red = Vimentin, Blue = DAPI). **e**, Cytokine multiplex results showing fold change of cytokines in D4 supernatant as compared to hCOs;

## Chapter 3. DE NOVO DESIGNED OF ENDOCYTOSIS LIGANDS FOR TARGETED DEGRADATION

*Adapted from* Buwei Huang, Mohamad Abedi, Green Ahn, Brian Coventry, Isaac Sappington, Rong Wang, Thomas Schlichthaerle, Jason Z. Zhang, Yujia Wang, Inna Goreshnik, Ching Wen Chiu, Adam Chazin-Gray, Sidney Chan, Stacey Gerben, Analisa Murray, Shunzhi Wang, Jason O'Neill, Ronald Yeh, Ayesha Misquith, Anitra Wolf, Luke M. Tomasovic, Dan I Piraner, Maria J. Duran Gonzalez, Nathaniel R. Bennett, Preetham Venkatesh, Maggie Ahlrichs, Craig Dobbins, Wei Yang, Xinru Wang, Dionne Vafeados, Rubul Mout, Shirin Shivaiei, Longxing Cao, Lauren Carter, Lance Stewart, Jamie B. Spangler, Gonçalo J.L. Bernardes, Kole T. Roybal, Per Jr. Greisen, Xiaochun Li, Carolyn Bertozzi, David Baker. **Designed Endocytosis-Triggering Proteins mediate Targeted Degradation.** *bioRxiv* 2023.08.19.553321; doi: <https://doi.org/10.1101/2023.08.19.553321>

### ABSTRACT

As originally published Endocytosis and lysosomal trafficking of cell surface receptors can be triggered by interaction with endogenous ligands. Therapeutic approaches such as LYTAC<sup>1,2</sup> and KineTAC<sup>3</sup>, have taken advantage of this to target specific proteins for degradation by fusing modified native ligands to target binding proteins. While powerful, these approaches can be limited by possible competition with the endogenous ligand(s), the requirement in some cases for chemical modification that limits genetic encodability and can complicate manufacturing, and more generally, there may not be natural ligands which stimulate endocytosis through a given receptor. Here we describe general protein design approaches for designing endocytosis triggering binding proteins (EndoTags) that overcome these challenges. We present EndoTags for the IGF-2R, ASGPR, Sortillin, and Transferrin receptors, and show that fusing these tags to proteins which bind to soluble or transmembrane protein leads to lysosomal trafficking and target degradation; as these receptors have different tissue distributions, the different EndoTags could enable targeting of degradation to different tissues. The modularity and genetic encodability of EndoTags enables AND gate control for higher specificity targeted degradation, and the localized secretion of degraders from engineered cells. We find further that EndoTag fusion can trigger endocytosis-activated receptor signaling and modulate the E<sub>max</sub> of this signaling reaching up to 100 fold induction. The tunability and modularity of our genetically encodable EndoTags should contribute to deciphering the relationship between receptor engagement and cellular trafficking, and they

have considerable therapeutic potential as targeted degradation inducers, signaling activators for endocytosis-dependent pathways, and cellular uptake inducers for targeted antibody drug and RNA conjugates.

## INTRODUCTION

The endocytosis of many cell surface receptors is triggered by binding of their endogenous ligands which can shift the conformational or oligomerization state of the receptor<sup>1</sup> and induce receptor clustering and adaptor protein recruitment<sup>2,6</sup>. Native endocytosis inducing ligands have been utilized to enhance intracellular delivery and prompting extracellular protein degradation<sup>1-3</sup>. While powerful, these approaches have the limitations that native ligands can trigger off-targeting signaling<sup>3,7</sup>, their binding sites may be occupied by existing ligands, and instability and in some cases the need for modification can complicate manufacturing<sup>8</sup>. Bio-orthogonal inducers of endocytosis could have therapeutic utility not only for targeted degradation but also for initiating signaling through pathways involving endocytosis<sup>4</sup>, and provide powerful tools for investigating the association between cellular trafficking and receptor structures. Antibodies have been identified that stimulate endocytosis, but this can require considerable empirical screening for any target receptor<sup>9,10</sup>. To date there does not exist a completely synthetic and systematic approach to design such orthogonal and synthetic activators of cellular trafficking.

We reasoned that de novo protein design could enable the creation of bio-orthogonal endocytosis inducing proteins that avoid the above limitations by using strategies customized for the target receptor. For receptors such as sortilin and the transferrin receptor, that constitutively traffic between the cell surface and the endosome/ lysosome, binding to a site on the receptor non-overlapping with the native ligands could be sufficient (**Fig. 1a**). For receptors such as the IGF-2R receptor, for which conformational change triggers endocytosis, binding must induce rearrangement of receptor extracellular domains, while for others, such as ASGPR, where endocytosis is stimulated by clustering, binding should induce oligomerization. Fusion of

designed proteins with these properties to a second target binding protein could promote endocytosis and lysosomal trafficking of the target. We set out to design such endocytosis targeting proteins, which we call EndoTags, for all four receptor systems, and to explore their utility for modulating protein degradation and cellular signaling.

To enable tissue-specific control over endocytosis for downstream applications, we selected target receptors with distinct tissue expression profiles. IGF-2R is expressed in most tissues, ASGPR is expressed primarily in the liver, TfR and Sortilin are both abundant in the brain, where TfR has broader expression in liver and muscles while Sortilin distributes in the spinal cord<sup>11,12</sup>. We developed customized design approaches to optimize endocytosis through each of these receptor systems, as described in the following sections.

### 3.1 DESIGN OF ENDOTAGS ORTHOGONAL TO ENDOGENOUS LIGANDS

TfR and Sortilin constitutively cycle between the cell surface and intracellular compartments. Thus, for these receptors, the challenge is not to actively induce endocytosis, but to bind to the receptor at a site that does not compete for the natural ligand, which could have undesired side effects and reduced efficiency. De novo protein design has the advantage of being able to target binders to specific sites of interest on a target<sup>13-15</sup>, and thus is well suited to designing protein binders that target receptor sites that do not overlap with those of native ligands.

Sortilin is a rapid trafficking receptor with considerable expression in the neural system which plays a role in lysosomal targeting of neurotrophin<sup>16,17</sup>. We sought to design protein binders of Sortilin at binding sites not overlapping with native ligands including neurotrophin (**Fig. 1a,b**). We used Rosetta de novo binder design<sup>18</sup> (**Extended Data Fig. 1a**) to generate 21,000 binders against the epitope (F92, V93, T546, T559, and T561) of Sortilin (**Extended Data Fig. 1b-c**), while avoiding any sites of known interactions and of significant structural change at low pH<sup>16</sup>. After experimental screening with yeast display and BLI (Biolayer Interferometry), the best candidate (Sortmb) bound Sortilin with 21nM affinity (**Extended Data Fig. 2g**). To validate the binding accuracy for Sortmb, we designed and expressed four Sortilin variants that contain N-linked glycan close to the designed Sortmb interface. In the yeast display assay, the binding affinity of Sortmb1 was reduced (**Extended Data Fig. 8a-f**), indicating that N-linked glycans are present

in the designed interface and the computationally designed binder was binding to the intended interface. We next evaluated the ability of the binder (Sort\_EndoTag) to drive internalization by flow cytometry. After incubation of 200nM fluorescence-labeled Sort\_EndoTag with U-251 MG glioblastoma cells for two hours at 37°C followed by extensive washing, there was a ninety fold increase in fluorescence compared to fluorophore conjugated control (**Fig. 1c**). Confocal imaging indicated co-localization of the Sort\_EndoTag with a lysosomal marker after 24 hours incubation in U-251MG cells (**Fig. 1d, Extended Data Fig. 5a**).

We applied a similar orthogonal binding strategy with TfR (**Fig. 1b**) whose native function is to transport iron-bound transferrin into cells and across the blood brain barrier<sup>12,18</sup>. We previously reported the design of TfR binders with high binding affinity at a binding site distant from the transferrin binding site<sup>19</sup>; here we explore the use of this binder as an EndoTag (TfR\_EndoTag). We found that the TfR\_EndoTag directed endocytosis in U-251MG glioblastoma cells, with a fifty fold increase in cellular uptake over control after two hour incubation (**Fig. 1c**). Confocal imaging again indicated lysosome targeting of the TfR\_EndoTag after 24 hours incubation in U-251MG cells (**Extended Data Fig. 5b**).

Taken together, these results with Sortilin and Tfr indicate that binding to bio-orthogonal sites with single high-affinity binding domains is an effective strategy for hijacking constitutively endocytosing receptors. Our bio-orthogonal binder design approach could be readily generalized to a wide range of other tissue specific targets.

### 3.2 DESIGN OF ENDOTAGS FOR TRIGGERING CONFORMATIONAL CHANGE

IGF-2R is a large cell surface receptor that rapidly transports its natural ligands IGF-2 and M6P to the lysosome for degradation<sup>1</sup>. IGF-2R has high abundance across tissues, and considerable overall lysosomal trafficking capacity which has made it an attractive target for protein degradation approaches. Structure investigation suggests that IGF-2 binding induces a conformational change in IGF-2R which brings together domain 6 (D6) and domain 11 (D11), and promotes dimerization of the receptor<sup>20</sup>. With the ability to design de novo binders at arbitrary interfaces<sup>15</sup>, we hypothesized that a designed binding protein that brings together domain 6 and 11 could similarly trigger IGF-

2R endocytosis and lysosomal targeting without triggering off-target signaling activation like IGF-2<sup>1</sup>.

We sought to use the Rosetta RIFdock method<sup>13,14</sup> to design small proteins that bind to D11 and D6 of IGF-2R independently. Inverse rotamer fields were generated around residues interacting with IGF-2R in both domains (**Extended Data Fig. 1d-g**), and scaffolds were docked into these fields with RIFdock<sup>21</sup>. After sequence optimization and refinement with RosettaFastdesign, the best scoring binding motifs were identified and grafted back on to the scaffold library with RosettaMotifgraft<sup>15</sup>, followed by another round of RosettaFastdesign. Genes encoding the top-ranked 15,000 designs based on Rosetta interface metrics (ddg, contact\_molecular\_surface)<sup>13</sup>, were synthesized on an oligonucleotide array, transformed into a yeast display vector, and fluorescence-activated cell sorting (FACS) was carried out using biotinylated human IGF-2R domain 6 and domain 11. After next-generation sequencing, we identified one high-affinity candidate binder for domain 6 and two candidate binders for domain 11; these were expressed and purified in E. coli. The IGF-2R domain 6 binder (D6mb) affinity of 41nM KD was measured using biolayer interferometry (BLI) (**Extended Data Fig. 2a**), and the best domain 11 minibinder (D11mb) bound IGF-2R domain 11 at an affinity of 190nM KD (**Extended Data Fig. 2b**). After affinity optimization with mutation library screening, the highest affinity variant for D11 (D11mb2) bound domain 11 at 6.5nM KD in BLI (**Extended Data Fig. 2c**).

We next sought to develop IGF-2R EndoTags (IGF\_EndoTags) utilizing the distinct IGF-2R D6 and D11 minibinders (**Fig. 1e**). Initially, we explored the use of flexible fusions between D11mb and D6mb, with different loop lengths and domain orders. We then expressed these fusions in E. coli and incorporated an avi-tag for biotinylation. Finally, we evaluated their cellular uptake in Jurkat cells by utilizing Alexa-647 (AF-647) and flow cytometry. A construct connecting D11mb and D6mb with a GGS linker (D11mb-GGS-D6mb, IGF\_EndoTag1) was the most readily uptaken, with increased cell associated fluorescence signal over native IGF-2 or D6mb/D11mb alone in Jurkat cells (**Extended Data Fig. 4c**). Co-localization imaging indicated that IGF\_EndoTag1 is targeted to lysosomes (**Fig. 1g**): this synthetic ligand thus recapitulates the trafficking of the endogenous IGF-2 ligands. Longer linkers decreased the uptake level, while a shorter GS linker abolished all uptake (**Extended Data Fig. 4b**), suggesting the orientation and distance of the two binding domains modulates the IGF-2R endocytosis process. Constructs with

two copies of one mini-binder (D6mb-linker-D6mb, D11mb-linker-D11mb did not display any cellular uptake (**Extended Data Fig. 4a**); engagement of both domains (likely driving their reorientation within the receptor structure) appears to be necessary to trigger efficient cellular uptake. Substitution of D11mb with the higher affinity variant D11mb2 in IGF\_EndoTag1 (generating IGF\_EndoTag2) increased internalization to 2 fold compared to native IGF-2 in Jurkat cells (**Fig 1f**); IGF\_EndoTag2 was clearly detectable in lysosomes after a 30 minute incubation, unlike IGF-2 or IGF\_EndoTag1 (**Extended Data Fig. 4d-e**).

We reasoned that still more potent stimulation of endocytosis could be achieved by two domain constructs in which the individual domains are rigidly fused to each other to drive specific receptor conformational changes. We generated such fusions by using RFInpainting<sup>22</sup> to generate three-helix bundles combining the major interface helix from D11mb and two interface helices from D6mb (**Fig. 1e, Extended Data Fig. 3**). Designed residues within 3 angstroms (Å) of the receptor were kept fixed, the D11mb helix was randomly perturbed by rigid body translations (up to 5 angstroms) and rotations (up to 10 degrees), the two chains were connected by inpainting, and the sequence of the fusion designed in the context of IGF-2R using ProteinMPNN<sup>23</sup> keeping residues interacting with the receptor constant. Models with RosettaFold LDDT metrics (>0.5) for the inpainted region and AlphaFold2<sup>24</sup> (AF2) structure predictions for the fusions matching the design models (RMSD < 2.0) were experimentally screened for binding with yeast display against both IGF-2R domains. Out of 170 screened designs, the 8 most enriched candidates were selected for protein expression and BLI affinity evaluation. Different designs had distinct affinities for domains 6 and 11; for example, IGF\_EndoTag3 possessed strong binding affinity to both domains (6nM for domain 6 and 190nM for domain 11, **Extended Data Fig. 2d**), while EndoTag4 bound more tightly to domain 6 (15nM for domain 6 and 4.3µM for domain 11, **Extended Data Fig. 2e**). In cellular uptake assays, IGF\_EndoTag3 had internalization activity equivalent to IGF-2, and IGF\_EndoTag4 showed 2 fold higher internalization than IGF-2 (**Extended Data Fig. 4c**) and co-localized with lysosomes within 30 minutes as we observed in co-localization imaging (**Extended Data Fig. 4f**).

### 3.3 DESIGN OF ENDOTAGS FOR INDUCING RECEPTOR CLUSTERING

The endocytosis of receptors such as ASGPR and EGFR is stimulated through dimerization or oligomerization<sup>25</sup>. ASGPR is a liver-specific ligand shuttling receptor to transport GalNAc labeled proteins into lysosomes for clearance<sup>26</sup>. Multivalent GalNAc ligands have been used for multiple liver-specific degradation applications<sup>2,27</sup> and RNA delivery platforms<sup>28</sup>. However, these require chemical modification and hence are not genetically encodable, and must compete with native ligands which raises challenges.

We designed binders to ASGPR that do not overlap with the glycan binding sites (**Extended Data Fig. 1h&i**) using an augmented version of the Rosetta design approach described above that uses ProteinMPNN<sup>23</sup> for sequence design and AlphaFold2<sup>18</sup> for design evaluation. 2689 designs passed AlphaFold2 pae\_interaction cutoff and were selected for experimental screening. After yeast display enrichment and NGS, we identified 4 candidates that bound to ASGPR on the yeast surface. Following expression and purification from E coli, biolayer interferometry showed that the highest affinity of these, (ASmb1), binds to ASGPR with an affinity of 2.7  $\mu$ M (**Extended Data Fig. 2f**).

To stimulate ASGPR endocytosis through clustering, we connected two or three ASmb1 domains with GS linkers to generate ASGPR EndoTags, which we refer to as AS\_EndoTags-2C and AS\_EndoTags-3C (**Fig. 1h**). Cellular uptake assays in Hep3B cells indicated that multivalent AS\_EndoTags-2C and AS\_EndoTags-3C were endocytosed more efficiently than monomeric ASmb1 (following a two hour incubation and extensive washing, 2.5-fold and 4.5-fold more fluorescence was associated with cells, respectively (**Fig. 1i**)). Confocal imaging showed that AS\_EndoTag-3C strongly co-localized with lysosomes after 24h (**Fig. 1j, Extended Data Fig. 5c**).

### 3.4 CELL SURFACE RECEPTOR DEGRADATION

Targeted degradation of receptors and extracellular soluble proteins is a promising therapeutic strategy for cancer, autoimmune diseases and neurodegenerative diseases. Lysosome-targeting

Chimeras (LYTACs) utilize mannose-6-phosphonate (M6Pn) ligands which triggers lysosomal delivery and degradation of the targeted proteins through the IGF-2R<sup>1,29</sup>, or N-acetylgalactosamine (GalNAc) to trigger the ASGPR lysosomal trafficking pathway<sup>3</sup>. While very promising, the LYTAC approach is hindered by the reliance on existing native ligands and by the sophisticated chemistry required to generate multivalent modifications that increase endocytosis potency, complicating their manufacturing. Given their potent and rapid endocytosis and lysosomal targeting ability, we hypothesized that the fusion of EndoTags with POI-specific binders to generate protein-LYTACs (pLYTAC) (**Fig. 2a**), could provide an orthogonal and genetically-encoded approach for efficient extracellular protein degradation, and the different tissue distributions of the different receptors could allow targeting of degradation to different tissues.

To explore the potential of pLYTACs in promoting protein degradation, we investigated their ability to target and degrade cell surface receptors. We started by focusing on the Epidermal Growth Factor Receptor (EGFR), which is often overexpressed in various cancer types and plays an important role in regulating cell proliferation<sup>30</sup>. We first assessed the degradation efficiency of the liver specific AS\_EndoTags. Consistent with the cellular uptake results (**Fig. 1k**), introduction of EGFRn fusions to AS\_EndoTags-2C and AS\_EndoTags-3C resulted in a 40% decrease in total EGFR levels, while fusions to the monomeric ASGPR binder had little effect (**Fig. 2b**). Thus, designed protein mediated clustering of ASGPR can drive lysosomal targeting and cargo degradation, and the ASGPR-EndoTags could serve as liver-specific targeted degraders. To generate EGFR-pLYTACs targeting in the brain, we fused TfR\_EndoTag and Sort\_EndoTag with a minibinder targeting EGFR N-terminal (EGFRn)<sup>31</sup>. We observed efficient clearance of EGFR in HeLa cancer cells after 48h incubation, with 55% reduction of EGFR by EGFRn-TfR\_EndoTag (**Fig. 2c**) and 78% reduction of EGFR by EGFRn-Sort\_EndoTag western blot (**Fig. 2d**). Given the abundant expression of the corresponding receptors in the brain, both TfR\_EndoTag and Sortilin\_EndoTag could function as pLYTACs for neurodegenerative disease applications.

We next sought to make systemically active pLYTACs that act through the ubiquitously expressed IGF-2 receptor. To this end, we fused IGF\_EndoTags to EGFRn, and found that in H1975 and HeLa cells, EGFR was effectively cleared from the whole cell lysate, as evidenced by western blot analysis (**Fig. 2e&f, Extended Data Fig. 6b**). EGFRn-IGF\_EndoTag2 was the most effective, leading to more than 80% clearance of EGFR, while EGFRn-IGF\_EndoTag1 resulted in 70%

clearance. The flexible EGFRn-IGF\_EndoTag1&2 had higher degradation capacity than the rigid constructs (IGF\_EndoTag3&4) (**Fig. 2f**), perhaps due to better interactions with EGFR. Mass spectrometry-based proteomic analyses confirmed that EGFRn-IGF\_EndoTag2 and EGFRn-IGF\_EndoTag1 significantly reduced EGFR levels in both HeLa and H1975 cells without affecting IGF-2R levels (**Fig. 2g, Extended Data Fig. 6e**); EGFRn without EndoTag had no effect on EGFR levels (**Fig. 2g, Extended Data Fig. 6d**).

To compare with the original M6P-based LYTACs, we generated genetic fusions of EndoTag1 with Cetuximab (CTX), a clinically-approved therapeutic antibody that targets EGFR with high affinity<sup>31</sup>. In H1975 cells, CTX-IGF\_EndoTag1 led to more effective degradation of EGFR than the M6P-based LYTAC (**Fig. 2e**)<sup>1</sup>. Proteomic analyses demonstrated that CTX-IGF\_EndoTag1 elicited a significantly greater reduction in EGFR levels compared to CTX alone (**Extended Data Fig. 6f-g**), with little effect on IGF-2R levels. CTX has a higher affinity for EGFR, and hence required a lower dose for effective degradation: CTX-IGF\_EndoTag1 achieved 85% degradation at a concentration of 10nM (**Extended Data Fig. 6a**).

We next investigated targeted degradation of Programmed Death-Ligand 1 (PD-L1), an immune checkpoint in cancer immunotherapy, and therefore an attractive target for this approach<sup>32</sup>. We genetically fused pLYTACs at the C-term of Atezolizumab (Atz), a potent PD-L1 inhibitor<sup>33</sup>, then tested PD-L1 clearance ability. All of the Atz-EndoTags effectively degraded PD-L1 on the cell surface of MDA-MB-231 cells within 4 hours, with EndoTag2 achieving the highest clearance percentage of 90% after 24 hours of incubation (**Extended Data Fig. 6h**). Western blot analysis of the whole cell lysis indicated that Atz-EndoTag2 molecules were able to deplete 77% of PD-L1 in the whole cell after 48h incubation (**Fig. 2h**). Like PD-L1, cytotoxic T lymphocyte antigen 4 (CTLA4) is an immune checkpoint component for which inhibitors have shown promising antitumor effects<sup>38,39</sup>. To target CTLA4, we generated a genetic fusion between EndoTag1 and a minibinder against CTLA4 (CTLA4mb) [permission of unpublished] which resulted in a 45% decrease of CTLA4 in Jurkat-CTLA4 cells after only 3 hours (**Extended Data Fig. 6c**).

### 3.5 CLEARANCE OF SOLUBLE PROTEINS

We next investigated the ability of EndoTags to degrade targeted soluble proteins as soluble pLYTACs (**Fig. 3a**). As a first proof of concept we employed the nanomolar affinity de novo designed protein heterodimer LHDA and LHDB, which has been used as the basis for synthetic signaling systems<sup>36</sup>, [accompanying manuscript]). We fused LHDA to IGF\_EndoTags, and LHDB to AF647, and found that the EndoTags significantly enhanced the uptake of LHDB-AF647 in both Jurkat and K562 cells (**Fig. 3b, Extended Data Fig. 7a&b**), with IGF\_EndoTag3 producing a remarkable 40-fold increase in mean fluorescence intensity (MFI) compared to the control. Incubation of Jurkat cells with 100nM LHDA-IGF\_EndoTag3 resulted in a 50% clearance of 100nM LHDB from the solution after 48h incubation in Jurkat cells (**Fig. 3c**; clearance may be limited by the number of available receptors).

We next investigated the potential of the pLYTAC system to eliminate disease-relevant soluble protein targets such as autoantibodies that recognize self-antigens which have been linked to multiple autoimmune diseases<sup>37</sup>. We first tested whether the fusion of EndoTags with IgG binding protein G<sup>38</sup> could clear IgG in solution. proteinG-IGF\_EndoTags were generated by genetically fusing proteinG with various EndoTags and purified after expression in E coli. As a benchmark comparison to glycan-based LYTAC, ProteinG-M6Pn was generated by conjugating proteinG with azido-NHS ester followed by M6Pn-BCN peptide. All fusion proteins including EndoTag constructs together with proteinG-M6Pn were then incubated with IgG-AF647 and Jurkat cells. All candidates triggered considerable uptake of IgG in both Jurkat and K562 cells (**Extended Data Fig. 7c&e**). ProteinG-IGF\_EndoTag3 elicited 2 fold higher cellular uptake of IgG than proteinG-M6Pn, leading to an overall 80 fold increase in IgG in K562 cells and 360 fold increase in Jurkat cells (**Extended Data Fig. 7e**). To quantify the clearance of IgG in the solution, we measured the fluorescence intensity in the cell culture supernatant normalized by that in control cells treated with IgG-AF647 alone. Incubation of 100nM proteinG-IGF\_EndoTag3 with 133nM IgG resulted in depletion of 70% of the IgG after 48 hours in Jurkat cells (**Fig. 3e**). IGF\_EndoTag3 elicited the higher clearance of IgG in Jurkat cells compared to the flexible IGF\_EndoTag1&2, and a proteinG-M6Pn control (**Extended Data Fig. 7d&f**). IGF\_EndoTag4 was less potent (**Extended Data Fig. 7h**). Utilizing confocal microscopy in HeLa cells, we observed enhanced co-localization of IgG with lysosomes following treatment with proteinG-IGF\_EndoTag3 for 24 hours, indicating that

the EndoTags actively facilitated the transportation of IgG to the lysosomes for degradation (**Fig. 3f**); this co-localization was not observed in HeLa cells not expressing IGF-2R (**Fig. 3g**).

### 3.6 LOGIC GATED TARGETED DEGRADATION AND LOCALLY SECRETABLE DEGRADERS

Many targets of interest are expressed not only in diseased tissues but also on healthy cells, and the ability to target protein degradation to specific cell subpopulations could reduce toxicity. For example, in the case of cancer, target degradation conditioned on the presence of a specific marker in the tumor microenvironment could help avoid undesired effects on healthy cells. Such logic gated targeted degradation has not been achieved with current extracellular protein degradation systems. To address this limitation, we utilized the colocalization-dependent protein switches (Co-LOCKR) system, which functions as an AND logic gate only exposing a recruitment motif when two target cell markers are present on the same cell (**Fig. 4a**). We utilized Co-LOCKR to selectively degrade EGFR when HER2 was also present on the surface of cancer cells<sup>39</sup>. We fused EndoTag with Bcl2, which binds the Bim peptide exposed upon coincident binding in this version of Co-LOCKR, and evaluated EGFR degradation level in both HER2+ and HER2- cells. In K562 cells overexpressing both EGFR and HER2, Bcl2-IGF\_EndoTag2 resulted in 80% degradation of EGFR, while in K562 cells expressing only EGFR without HER2, the EGFR level remained unchanged (**Fig. 4b**). Thus the EndoTag system can be precisely targeted to specific cells based on combinations of surface markers.

Another major challenge is the degradation of the degrader itself upon binding cells that express the target endocytosis receptor, which could increase the dose of drug required. In the context of adoptive cell therapies or mRNA delivery, the secretion of a degrader locally in response to stimuli could potentially overcome this challenge. Our system offers a solution as it is fully protein based and consequently can be locally secreted with high specificity and efficiency<sup>40,41</sup>. To investigate this possibility, we transiently transfected IGF-2R KO HeLa cells with plasmids encoding EGFRn-IGF\_EndoTag, collected the cell supernatants, and incubated them with EGFR+ K562 cells while

monitoring EGFR expression levels (**Fig. 4c**). Secreted EGFRn-IGF\_EndoTag1 led to similar EGFR clearance as the exogenously added EGFRn-IGF\_EndoTag1 (**Fig. 4d**), while secreted EGFRn-IGF\_EndoTag2 was more potent, consistent with the results obtained with the purified proteins. Thus EndoTags remain functional when secreted from cells, providing a potential avenue for their use in adoptive cell therapy control systems.

### 3.7 ENDOTAG ACTIVATED CELL SIGNALING

Transmembrane signaling from extracellular ligands binding to plasma membrane receptors is frequently accompanied by endocytosis of the ligand, and in some cases signaling may take place in part or primarily in the endosome<sup>42</sup>. We reasoned that in such cases our EndoTags could potentially increase signaling potency of a ligand by increasing the fraction of the ligand-receptor complex present in the endosome. We used as a model system a minimalist Notch-derived synthetic signaling system, ortho-SNIPR [accompanying manuscript], for which endocytosis inhibitor experiments suggested that it was primarily activated by endocytosis. Ortho-SNIPR is based on the same LHD designed heterodimer described above, with an LHDA containing synthetic ligand and a receptor consisting LHDB extracellular domain fused to the transmembrane portion derived from Notch; binding of the ligand to the receptor results in cleavage and release of an intracellular transcription factor domain, which activates downstream BFP expression (**Fig. 5a**). We found that fusion of IGF\_EndoTags to the LHDA resulted in 50-fold and higher increases in signal activation than LHDA-C2 ligands where two copies of LHDA are flexibly linked (**Fig. 5b**), with the most potent IGF\_EndoTag2 fusion producing a striking 100-fold increase (**Fig. 5c**). IGF-EndoTag was not affected by small molecules that block engagement with cell surface proteases, but was blocked by chloroquine, which disrupts endosomal acidification, suggesting that EndoTag enhanced signaling occurs in the endosome (inhibition of  $\gamma$ -Secretase, which carries out the proteolytic cleavage needed to free the transcription factor, also blocked signaling) (**Fig. 5d**). Confocal microscopy showed rapid lysosomal targeting of the LHDA-IGF\_EndoTag2 construct (**Fig. 5e**). This considerable enhancement of signaling should make the SNIPR system a more powerful tool for synthetic biology and adoptive cell therapy applications—the ability to localize responses to specific target cells, either by using tissue specific EndoTags, or using Co-LOCKR

targeting makes this even more versatile. Further studies will be required to determine if EndoTags can enhance signaling through endogenous pathways. Conversely, for pathways that are downregulated by endocytosis, EndoTags could be used to shorten the signaling half-life, which could have utility in applications such as TCR signaling where overstimulation can lead to pathway inactivation.

## CONCLUSION

Targeted degradation has shown considerable promise as a therapeutic approach<sup>1,3</sup> by using native ligands or chemical modifications to engage with rapidly trafficking cell surface receptors. Our designed EndoTag approach extends the power of this therapeutic modality in several ways. First, while native ligands can trigger off-target signaling and competition with endogenous proteins can reduce potency [permission of unpublished], our designed EndoTags, as illustrated by the Sortillin, TfR and ASGPR cases (**Fig. 1b&e&h**), can be targeted to sites on endocytosing receptors that are not bound by native ligands. Second, high valency chemical modification<sup>1,2,4,5</sup> has been used to enhance endocytosis, but this complicates manufacturing<sup>1,2,3,14</sup>; as illustrated by our multi domain ASGPR EndoTags, small synthetic domains can be readily combined to create all protein receptor clustering and endocytosis stimulating proteins. The all-protein nature of our pLYTACs not only simplifies manufacturing, but also enables employment of targeted degradation approaches in adoptive cell therapies through secretion from engineered cells (**Fig. 4c**). The small, stable and readily producible synthetic ligands that could be useful not only for therapeutic applications but as molecular tools for probing how receptor conformations modulate cellular trafficking.

Moving forward, there are many avenues to pursue using our computational design approach to generating EndoTag stimulated enhancers of cell surface receptor endocytosis and trafficking. First, there are likely many more receptor targets which can undergo rapid endocytosis upon suitable triggering at the cell surface; our ability to design endocytosis stimulators without requiring native ligands or identification of chemical modifications should enable utilization of the full range of these receptors to achieve more tissue restricted targeting and modulatable intracellular trafficking (different receptors likely will have different

intracellular compartment residence times and transition dynamics). In addition to the targeted degradation application pursued here, such designed endocytosis stimulators could be of great utility for enhancing uptake of nucleic acid (siRNA for example) and small molecule drug conjugates. Second, there are likely natural signaling pathways which, like the synthetic SNIPER system, can be more potently activated by promotion of receptor endocytosis. We achieve an 100 fold enhancement of signaling E<sub>max</sub> by fusing the SNIPR ligand to EndoTags—if similar levels of signaling enhancement or modulation can be achieved by fusing natural signaling molecules to EndoTags there could be many applications for such increased potency molecules in therapeutics and biotechnology. Third, as illustrated by the use of the LOCKR system to make logic gated protein degradation systems and the secretion of EndoTag-degrader constructs from cells, the robustness and modularity of de novo designed protein and capability for logic gated activation and cell based expression open the door to a wide range of more precise and controllable strategies for protein and cell based therapies.

## **METHODS**

### **Computational design of Sortilin minibinders**

Using Rosetta-based binder design protocol<sup>13</sup>, 21,000 binders were generated to each of two sites on the Sortilin. The epitope of Site1 is comprised of five amino acids (Uniprot numbering: F92, V93, T546, T559, and T561) was chosen since it provided a modest patch of exposed hydrophobicity while avoiding any sites of known interactions. The selected epitope has the added feature that a binder to this location would be pH dependent since this region undergoes significant structural change at low pH<sup>16</sup>. As previously described<sup>13</sup>, we used a set of scaffold libraries to generate several million docks to each of the sites. As in the protocol, 100,000 were sub-selected and sequence designed. Helical motifs were extracted, and 3,000 designs were selected, grafted, and subjected to further design. Designs were filtered based on their Rosetta ddG and ContactMolecularSurface to the hydrophobic residues listed above. This resulted in 42,000 designs that were tested experimentally.

### **Computational design of IGF-2R and ASGPR minibinders**

The minibinders against IGF-2R domain 6 and 11 were computationally designed via a Rosetta-based approach previously described<sup>13</sup>. Briefly, the structures of IGF-2R domain 6 (PDB 6UM2) and IGF-2R domain 11 (PDB 1GP0) were refined using Rosetta Fastrelax with coordinate constraints. The residues at IGF-2 binding site for each domain were selected as “hotspot” residues. Helical protein scaffolds were docked against the hotspot residues via Patchdock followed by Rfdock protocol. After sequence optimization with Rosetta FastDesign and filtering with Rosetta interface metrics including *ddg* and *contact\_molecular\_surface*, the top candidates were then resampled with Rosetta Motifgraft and FastDesign. Candidates passing previous filters were then filtered again with exposed hydrophobicity (*sap\_score*) and optimized with a net-charge of -7.

The minibinders against ASGPR were designed with a Rosetta-based approach integrated with ProteinMPNN and AlphaFold2. The crystal structure of ASGPR (PDB 5JQ1) was refined and helical protein scaffolds were docked against the exposed hydrophobic residues via Patchdock followed by Rfdock. The sequences were optimized with protein-MPNN and interface scores were calculated with Rosetta Fastrelax. The models were then predicted by AlphaFold2 and scored after Fastrelax. Designs with *pae\_interaction*<10 and *relaxed\_ddg*<-40 were selected for resampling with another round of protein-MPNN prediction followed by Rosetta Fastrelax. After final round filtering with *pae\_interaction*, *relaxed\_ddg* and *sap\_score*, the sequences were further optimized to have a net-charge of -7.

### **Computational design of IGF\_EndoTags**

To generate flexible IGF-2R agonists, all combinations of Gly-Ser (GS) linkers with various lengths linking D6mb and D11mb were modeled with AlphaFold2. The designs with poor monomer *plddt* (*plddt*<85) were dropped.

To generate rigid IGF\_EndoTags, the major binding helix from D11mb or the native IGF-2 binding helix, and two interface helices from D6mb were extracted. Both crystal structures obtained for the domain 6 and 11 minibinders in complex with IGF-2 and IGF-2R were used as starting points for design. Domains 6 and 11 of the complex structures were aligned with the respective domains of IGF-2R in the putative receptor internalizing conformation available in the Protein Data Bank (PDB: 6UM2). In this orientation, the two interface helices from the domain 6 binder and the single interface helix from the domain 11 binder were extracted and used as motifs to scaffold by Protein Inpainting<sup>22</sup>. To increase the likelihood of design success, the D11 minibinder structure was adjusted to form an ideal three helical bundle with the two domain 6 helices. Protein Inpainting was implemented such that the interacting residues within 3

angstroms of the receptor maintained the same identity as in the original minibinders. To increase design diversity, the d11 helix motif was randomly perturbed by rigid body translations (up to 5 angstroms) and rotations (up to 10 radians) for each design prior to inpainting a scaffold between the motifs. The best inpainting outputs were selected by RosettaFold LDDT metrics ( $> 0.5$ ) for the inpainted region and used for sequence design with ProteinMPNN. ProteinMPNN sequence design was performed on the inpainted outputs in their desired complex orientation (with both domains 6 and 11 present) while fixing the original minibinder identities of interface residues (domain 6 minibinder: R4, V8, Q11, D15, V20, K24, M25, I27, I31, and E34, domain 11 minibinder: M1, A4, L7, L8, and W11). After 2000 sequences were generated for each ProteinMPNN input, designs were filtered by predicted Rosetta ddG. AlphaFold 2 structure predictions of the designed sequences were filtered by the pLDDT metric (keeping those with  $pLDDT > 90$ ), and designs with a subangstrom backbone atom RMSD to the original design models realigned to the D6 and D11 minibinder crystal structures (in complex with the IGFII-M6PR target domains). Finally, the complexes were assessed by Rosetta FastRelax. Designs with ddG metrics less than -40 and Spatial Aggregation Propensity scores less than 35 were selected for expression and experimental assays.

### **N-linked glycan verification of epitope**

To verify the epitope of the designed binders an N-linked glycan scan was performed. This was performed to rapidly determine if the computational designed binder was interacting with the chosen interface. Four engineered N-linked glycan variants (NN-0975, NN-0979, NN-0981, and NN-0977) with mutation close to the Sortimb binding site were designed and expressed. For design, the computational models were used as a starting point for the computational screen. All positions 10 Å away from the interface were screened using RosettaMatch<sup>44</sup> followed by a design step to introduce the NXS/T motif into the protein. Computational models were minimized and filtered based on geometrical restraints, CST-score  $< 5$ . Next, the four variants were used as bait in the yeast display assay against the computational designed binder, Sortimb, which was displayed on the surface of yeast.

### **Yeast surface display screening with FACS**

The yeast surface display screening was performed using the protocol as previously described<sup>13,15</sup>. Briefly, DNAs encoding the minibinder sequences were transformed into EBY-100 yeast strain. The yeast cells were grown in CTUG medium and induced in SGCAA medium. After washing with PBSF (PBS+1% BSA), the cells were incubated with 1 $\mu$ M biotinylated target proteins (IGF-2R, ASGPR, Sortilin) together

with streptavidin–phycoerythrin (SAPE, ThermoFisher, 1:100) and anti-c-Myc fluorescein isothiocyanate (FITC, Miltenyi Biotech, 6.8:100) for 30min. After washing twice with PBSF, the yeast cells were then resuspended in PBSF and screened via FACS. Only cells with PE and FITC double-positive signals were sorted for next-round screening. After another round of enrichment, the cells were titrated with biotinylated target protein at different concentrations for 30min, washed, and further stained with both streptavidin–phycoerythrin (SAPE, ThermoFisher) and anti-c-Myc fluorescein isothiocyanate (FITC, Miltenyi Biotech) at 1:100 ratio for 30min. After washing twice with PBSF, the yeast cells at different concentrations were sorted individually via FACS and regrown for 2 days. Next the cells from each subpool were lysated and their sequences were determined next-generation sequencing or Miseq.

For N-linked glycan verification, yeast cells displaying Sortmb were incubated with 100nM N-glycan variants of Sortilin (NN-0975, NN-0979, NN-0981, and NN-0977), separately. Percentage of yeast cells located within the pre-set gate was calculated for each N-glycan variants group and compared with the WT Sortilin group.

### **Biolayer interferometry**

The binding affinity for the minibinders were determined by the Octet RED96 (ForteBio). To measure the binding affinity, streptavidin-coated biosensors (ForteBio) were first loaded with biotinylated target proteins at 50~100nM concentration, washed with Octet buffer (10 mM HEPES, 150 mM NaCl, 3 mM EDTA, 0.05% surfactant P20 and 1% BSA), and incubated with titrated concentrations of corresponding binders. To measure the  $K_{off}$ , the biosensors were then dipped back into the Octet buffer. The  $K_{on}$ ,  $K_{off}$  and  $KD$  were further estimated with the Octet Analysis software.

### **Protein and purification**

Minibinders and minibinder fusions were expressed in E coli BL21 strain as previously described<sup>13</sup>. Briefly, the DNA fragments encoding the design sequences were assembled into pet-29 vectors via Gibson assembly and further transformed into BL21 strain with heat-shock. Protein expression was induced by the autoinduction system and proteins were purified with Immobilized metal affinity chromatography (IMAC) approach. Next the elutions were purified by FPLC SEC using Superdex 75 10/300 GL column (GE Healthcare). Protein concentrations were determined by NanoDrop (Thermo Scientific) and normalized by extinction coefficients.

Antibody-EndoTag fusions were produced with a mammalian expression system. Light chain of CTX/ATZ antibody and heavy chain fused with EndoTag at C-term constructs were ordered in CMVR from Genscript. Antibody-EndoTag fusions were then expressed via transient co-transfection of the EndoTag-heavy and light chains into Expi293F cells (Life Technologies) via PEI-MAX (Polyscience). In brief, 800mL cultures of Expi293F cells were transfected at a density of  $3 \times 10^6$  cells per mL of culture using 1 ug of plasmid DNA and 3ug of PEI per mL of culture. These cultures were grown in Expi293F expression medium (Life Technologies) at 37°C in a humidified, 8% CO<sub>2</sub> incubator rotating at 125rpm.

After 6 days of expression, culture supernatants were harvested via 5 minutes of centrifugation at 4000 RCF, 5 minutes of incubation with PDADMAC solution (Sigma Aldrich) added to a final concentration of 0.0375%, followed by an additional 5 minutes of centrifugation at 4000 RCF. Supernatants were clarified via 0.22um vacuum filtration and then treated to a final concentration of 50mM Tris-HCl (pH 8) and 350mM NaCl for IMAC. Gravity IMAC was performed by batch binding the clarified supernatants with 10mL of Ni Sepharose Excel resin (GE Healthcare). After 20-30 minutes of incubation, the resin bed was washed with 10 CV of 20mM Tris-HCl (pH8), 300mM NaCl solution. The proteins were then eluted with 3 CV of 20mM Tris-HCl (pH 8), 300mM NaCl, 300mM imidazole solution. The batch bind process was then repeated with half the amount of resin (5mL) and the eluates from both batch binds were combined. SDS-PAGE was performed on the IMAC eluates to assess purity.

The purified antibody-EndoTag fusions were subsequently concentrated in a 10K MWCO Amicon Ultra centrifugal filter unit (Millipore) and polished via SEC using a Hiload 26/600 Superose 200 column (GE Healthcare) in DPBS (Gibco). The SEC fractions were re-concentrated in the same manner as before to a final concentration of 5 mg/mL. Endotoxin levels were assayed via Endosafe LAL Endotoxin tests (Charles River) and analytical SEC was performed using a Superdex 200 Increase 5/150 column (GE Healthcare) to obtain a high-resolution size profile. Pre- and post-freeze stability was assessed via UV-Vis spectrophotometry as well as SDS-PAGE.

### **Cellular uptake evaluation and receptor degradation via flow cytometry**

For cellular uptake assays using suspension cell lines (K-562, Jurkat), the cells were incubated with corresponding fluorescence-labeled protein constructs at 37 °C for indicated time, then spun down at 500g for 5min, resuspended and washed with cold PBS. After three washes, the cells were resuspended and transferred to a 96-well plate. For cellular uptake assays using adherent cell lines (U-251MG, Hep3B,

HeLa, H1975), the cells were incubated with corresponding fluorescence-labeled protein constructs at 37 °C for indicated time, then washed with cold PBS for three times. The cells were then treated with 50uL of trypsin and incubated at 37 °C for 10 min followed by adding 50uL of DMEM media. The resuspended cells were then transferred to a 96-well plate followed by two PBS washes. Flow cytometry was then performed in Attune NxT flow cytometer (Thermo Fisher). The data was analyzed in FlowJo software.

For cell surface receptor degradation experiments, the cells were first incubated with corresponding protein reagents for indicated time at 37 °C, then washed with cold PBS three times. For suspension cell lines, the cells were resuspended and transferred to the 96-well plate; for adherent cell lines, the cells were first treated with trypsin for 10 minutes then transferred to the 96-well plate. The cells were then stained with corresponding fluorescence-labeled antibodies against the corresponding receptor for 1 hour at room temperature. After washing three times with cold PBS for flow cytometry, flow cytometry was performed in Attune NxT flow cytometer (Thermo Fisher). The data was analyzed in FlowJo software.

### **Protein degradation via Western blot**

Cells were cultured in T75 flasks at 37 °C in a 5% CO<sub>2</sub> atmosphere. HEP3B (ATCC), HeLa (ATCC), and MDA-MB-231 were cultured in DMEM supplemented with 10% heat-inactivated fetal bovine serum (FBS) and 1% penicillin/streptomycin. Jurkat-CTLA4 and H1975 were cultured in RPMI supplemented with 10% heat-inactivated fetal bovine serum (FBS) and 1% penicillin/streptomycin. Adherent cells were plated (100,000 cells/well in a 24-well plate) one day before the experiment, whereas suspension cells were plated on the day of the treatment. Cells were incubated with 250 µl of complete growth media with pLYTAC or controls for indicated time. Cells were then washed with PBS 3 times and lysed with RIPA buffer supplemented with protease inhibitor cocktail (Roche), 0.1% Benzonase (Millipore-Sigma), and phosphatase inhibitor cocktail (Roche) on ice for 30 minutes. The cells were scraped, transferred to Eppendorf tubes, and spun down at 21,000g for 15 minutes at 4 °C. The supernatant was collected and the protein concentration was determined by BCA assay (Pierce). Equal amounts of lysates were loaded onto 4-12% Bis-Tris gel and separated by sodium dodecyl sulfate-polacrylamide gel electrophoresis (SDS-PAGE). Then, the gel was transferred onto a nitrocellulose membrane and stained with REVERT Total Protein Stain (LI-COR), then blocked with Odyssey Blocking Buffer (TBS) (LI-COR) for 1 hour at rt. The membrane was incubated with primary antibodies (rabbit anti-EGFR D38B1 Cell Signaling Technologies, rabbit anti-HER2 2242 Cell Signaling Technologies, rabbit anti-PD-L1 E1L3N Cell Signaling Technologies, rabbit anti-CTAL4 E1V6T Cell Signaling Technologies, mouse anti- vinculin V284 Bio-Rad) overnight at 4 °C, washed 3 times with TBS-T. Subsequently, the membrane was incubated with

secondary antibody (800CW goat-anti-mouse or goat-anti-rabbit LI-COR) for 1 hour at rt, and washed 3 times with TBS-T for visualization with an Odyssey CLx Imager (LI-COR). Image Studio (LI-COR) was used to quantify band intensities.

### **Fluorescence Imaging**

WT HeLa (ATCC CCL-2) were cultured at 37 °C with 5% CO<sub>2</sub> in flasks with Dulbecco's modified Eagle medium (DMEM) (Gibco) supplemented with 1 mM L-glutamine (Gibco), 4.5 g/liter D-glucose (Gibco), 10% fetal bovine serum (FBS) (Hyclone) and 1% penicillin-streptomycin (PenStrep) (Gibco). To passage, cells were dissociated using 0.05% trypsin EDTA (Gibco) and split 1:5 or 1:10 into a new tissue culture (TC)-treated T75 flask (Thermo Scientific ref 156499).

For imaging 35 mm glass bottom dishes were seeded at a density of 20k cells / dish. A final monomeric concentration of 100 nM of ligands were incubated with cultured cells. Cells were fixed 4% paraformaldehyde, permeabilized with 100% methanol, and blocked with PBS + 1% BSA. Cells were immunostained with Anti-LAMP2A antibody (Abcam ab18528) followed by goat anti-rabbit- IgG Alexa Fluor™ 488 secondary antibody (Thermo Fisher A-11034) and 4',6-diamidino-2-phenylindole (DAPI) (Thermo Fisher D1306) and stored in the dark at 4°C until imaging.

Cells were washed twice with HBSS and subsequently imaged in HBSS in the dark at 37°C. Right before imaging, cells were incubated with 25 μM DTZ. Epifluorescence imaging was conducted on a Yokogawa CSU-X1 microscope equipped with a Hamamatsu ORCA-Fusion scientific CMOS camera and Lumencor Celesta light engine. Objectives used were: 10×, NA 0.45, WD 4.0 mm, 20×, NA 1.4, WD 0.13 mm, and 40×, NA 0.95, WD 0.17–0.25 mm with correction collar for cover glass thickness (0.11 mm to 0.23 mm) (Plan Apochromat Lambda). All epifluorescence experiments were subsequently analyzed using NIS Elements software.

### **Confocal microscopy**

Indicated cells were seeded in 18 well glass bottom μ-Slides (Ibidi, Cat. No. 81817) at a density of 15k/well. Fluorescently labeled ligands were incubated with the cultured cells for 0.25 , 3, 6 or 24 hours, 30 min before image acquisition, cells were additionally incubated with LysoTracker (ThermoFisherScientific, Cat. No. L7528/L7526/L12492) was added for 30 minutes. Fluorescently labeled anti-IGF-2R (Novus

Biological, NB300-514AF647) was added for 30 minutes. Cells were washed 3× in PBS and immediately proceeded to imaging.

Confocal laser scanning microscopy was performed on a Nikon A1R HD25 system equipped with a LU-N4 laser unit (Lasers used: 488 nm, 561 nm, 640 nm). Data was acquired using an 20×, NA 0.75, WD 1.00 mm air objective (Plan Apochromat Lambda) in combination with 1 multialkaline (EM 650 LP) and 2 GaAsP detectors (DM 560 LP EM 524/42 (503-545) and DM 652 EM 600/45 (578-623)). Acquisition was controlled via NIS Elements software and data was analyzed via Fiji and custom-written Python Scripts.

### **Mass spectrometry and proteomic**

Cell pellets were thawed on ice and lysed in a lysis buffer (400  $\mu$ L, 1 tablet of Pierce EDTA-free Protease Inhibitor Tablets dissolved in 50 mL of PBS) using a probe sonicator (3  $\times$  3 pulses). Protein concentration was adjusted to 2.0 mg/mL and the samples (100  $\mu$ L, 200  $\mu$ g protein) were transferred to new Eppendorf tubes (1.5 mL) containing urea (48 mg/tube, final urea concentration: 8 M). DTT (5  $\mu$ L, 200 mM fresh stock in H<sub>2</sub>O, final DTT concentration: 10 mM) was then added to the tubes and the samples were incubated at 65°C for 15 min. Following this incubation, iodoacetamide (5  $\mu$ L, 400 mM fresh stock in H<sub>2</sub>O, final IA concentration: 20 mM) was added and the samples were incubated in the dark at 37°C with shaking for 30 min. Ice-cold MeOH (600  $\mu$ L), CHCl<sub>3</sub> (200  $\mu$ L), and H<sub>2</sub>O (500  $\mu$ L) were then added, and the mixture was vortexed and centrifuged (10,000 g, 10 min, 4°C) to afford a protein disc at the interface between CHCl<sub>3</sub> and aqueous layers. The top layer was aspirated without perturbing the disk, additional MeOH (600  $\mu$ L) was added, and the proteins were pelleted (10,000 g, 10 min, 4°C) and used in the next step or stored at -80°C overnight.

The resulting protein pellets were resuspended in EPPS buffer (160  $\mu$ L, 200 mM, pH 8) using probe sonicator (3  $\times$  3 pulses). Trypsin (10  $\mu$ L, 0.5  $\mu$ g/ $\mu$ L in trypsin reconstitute buffer) and CaCl<sub>2</sub> (1.8  $\mu$ L, 100 mM in H<sub>2</sub>O) were added and the samples were incubated at 37°C with shaking overnight.

Peptide concentration was determined using the microBCA assay (Thermo Scientific) according to the manufacturer's instructions. For each sample, a volume corresponding to 25  $\mu$ g of peptides was transferred to a new Eppendorf tube and the total volume was brought up to 35  $\mu$ L with EPPS buffer (200 mM, pH 8). The samples were diluted with CH<sub>3</sub>CN (9  $\mu$ L) and incubated with the corresponding TMT tags (3  $\mu$ L/channel, 20  $\mu$ g/ $\mu$ L) at room temperature for 30 min. An additional TMT tag (3  $\mu$ L/channel, 20  $\mu$ g/ $\mu$ L, 30 min) was added and the samples were incubated for another 30 min. Labeling was quenched by the addition of hydroxylamine (6  $\mu$ L, 5% in H<sub>2</sub>O). Following a 15 min incubation at room temperature,

formic acid was added (2.5  $\mu$ L, final FA concentration: 5%). 20  $\mu$ L labeled peptides of each channel were combined into a 2.0 mL low-binding Eppendorf tube, and 25  $\mu$ L of 20% formic acid was added. The resulting mixture was lyophilized to remove the solvents before high pH fractionation.

The spin columns from Pierce High pH Reversed-Phase Peptide Fractionation Kit were pre-equilibrated prior to use. Briefly, the columns were placed in Eppendorf tubes (2 mL), spun down to remove the storage solution (5,000 g, 2 min), and washed with CH<sub>3</sub>CN (2  $\times$  300  $\mu$ L, 5,000 g, 2 min) and buffer A (2  $\times$  300  $\mu$ L, 95% H<sub>2</sub>O, 5% CH<sub>3</sub>CN, 0.1% FA, 5,000 g, 2 min). TMT-labeled peptides were re-dissolved in buffer A (300  $\mu$ L, 95% H<sub>2</sub>O, 5% CH<sub>3</sub>CN, 0.1% FA) and loaded onto pre-equilibrated spin columns for high pH fractionation. The columns were spun down (2,000 g, 2 min) and the flow through was used to wash the original Eppendorf tube and passed through the spin column again (2,000 g, 2 min). The column was then washed with buffer A (300  $\mu$ L, 2,000 g, 2 min) and 10 mM aqueous NH<sub>4</sub>HCO<sub>3</sub> containing 5% CH<sub>3</sub>CN (300  $\mu$ L, 2,000 g, 2 min), and the flow through was discarded. The peptides were eluted from the spin column into fresh Eppendorf tubes (2.0 mL) with a series of 10 mM NH<sub>4</sub>HCO<sub>3</sub> / CH<sub>3</sub>CN buffers (2000 g, 2 min). The following buffers were used for peptide elution (% CH<sub>3</sub>CN): 7.5, 10, 12.5, 15, 17.5, 20, 22.5, 25, 27.5, 30, 32.5, 35, 37.5, 40, 42.5, 45, 47.5, 50, 52.5, 55, 57.5, 60, 62.5, 65, 67.5, 70, 72.5, 75, 80, 95. Every 10th fraction was combined into a new clean Eppendorf tube (2 mL) and the solvent was removed using a benchtop lyophilizer and stored at -20 °C before analysis.

The resulting 10 combined fractions were re-suspended in buffer A (25  $\mu$ L) and analyzed on the Orbitrap Fusion mass-spectrometer (4  $\mu$ L injection volume) coupled to a Thermo Scientific EASY-nLC 1200 LC system and autosampler. The peptides were eluted onto a capillary column (75  $\mu$ m inner diameter fused silica, packed with C18 and separated at a flow rate of 0.3  $\mu$ L/min using the following gradient: 5% buffer B in buffer A from 0-10 min, 5%–35% buffer B from 10-129 min, 35%–100% buffer B from 129-130 min, 100% buffer B from 130-139 min, 100%–5% buffer B from 139-140 min, and 5% buffer B from 140-150 min (buffer A: 100% H<sub>2</sub>O, 0.1% FA; buffer B: 20% H<sub>2</sub>O, 80% CH<sub>3</sub>CN, 0.1% FA). Data were acquired using an MS<sup>3</sup>-based TMT method. Briefly, the scan sequence began with an MS<sup>1</sup> master scan (Orbitrap analysis, resolution 120,000, 375–1600 m/z, cycle time 3s) with dynamic exclusion enabled (repeat count 1, duration 30 s). The top precursors were then selected for MS<sup>2</sup>/MS<sup>3</sup> analysis. MS<sup>2</sup> analysis consisted of: quadrupole isolation (isolation window was set to 1.2 for charge state  $z = 2$ ; 0.7 for charge state  $z = 3$ ; 0.5 for charge states  $z = 4-6$ ) of precursor ion followed by collision-induced dissociation (CID) in the ion trap (normalized collision energy 35%, maximum injection time 50 ms, MS<sup>2</sup> resolution was set to turbo). Following the acquisition of each MS<sup>2</sup> spectrum, synchronous precursor selection (SPS) enabled the selection of MS<sup>2</sup> fragment ions for MS<sup>3</sup> analysis (SPS isolation window was set to 1.3 for charge state  $z = 2$ ; 0.7 for charge state  $z = 3$ ; 0.5 for charge states  $z = 4-6$ ). MS<sup>3</sup> precursors

were fragmented by HCD and analyzed using the Orbitrap (collision energy 65%, maximum injection time 120 ms). The raw files were converted to mzML files using the MSConvert tool from ProteoWizard (version 3.0.22088). A reverse concatenated, non-redundant variant of the Human UniProt database (2022-11-29) was searched using FragPipe (version 18.0) with the built-in ‘TMT10-MS3’ workflow. The virtual references were used for the data sets due to the lack of a pooled sample. The quantified proteins were filtered with FDR < 1% with median centering normalization. Data are presented as the mean fold change to DMSO-treated controls. n= 3 per group. P values were calculated by a two-tailed unpaired t-test with Welch’s correction.

### **IgG/LHDB supernatant clearance assay**

Jurkat/K562 cells seeded in 96 culture plates in 300uL media were incubated with AF647 conjugated IgG (Novusbio) or LHDB alone or together with proteinG-EndoTag reagents. At various time points, the cells were pelleted down and 30uL of supernatants were extracted and further diluted to 45uL by using a PBS buffer. After shaking in an orbital shaker for 5 minutes, the fluorescence intensity was measured by Neo2 plate reader (BioTek) at wavelength 647 nm. The percentage clearance was measured by normalizing the control group without adding proteinG-EndoTag reagent.

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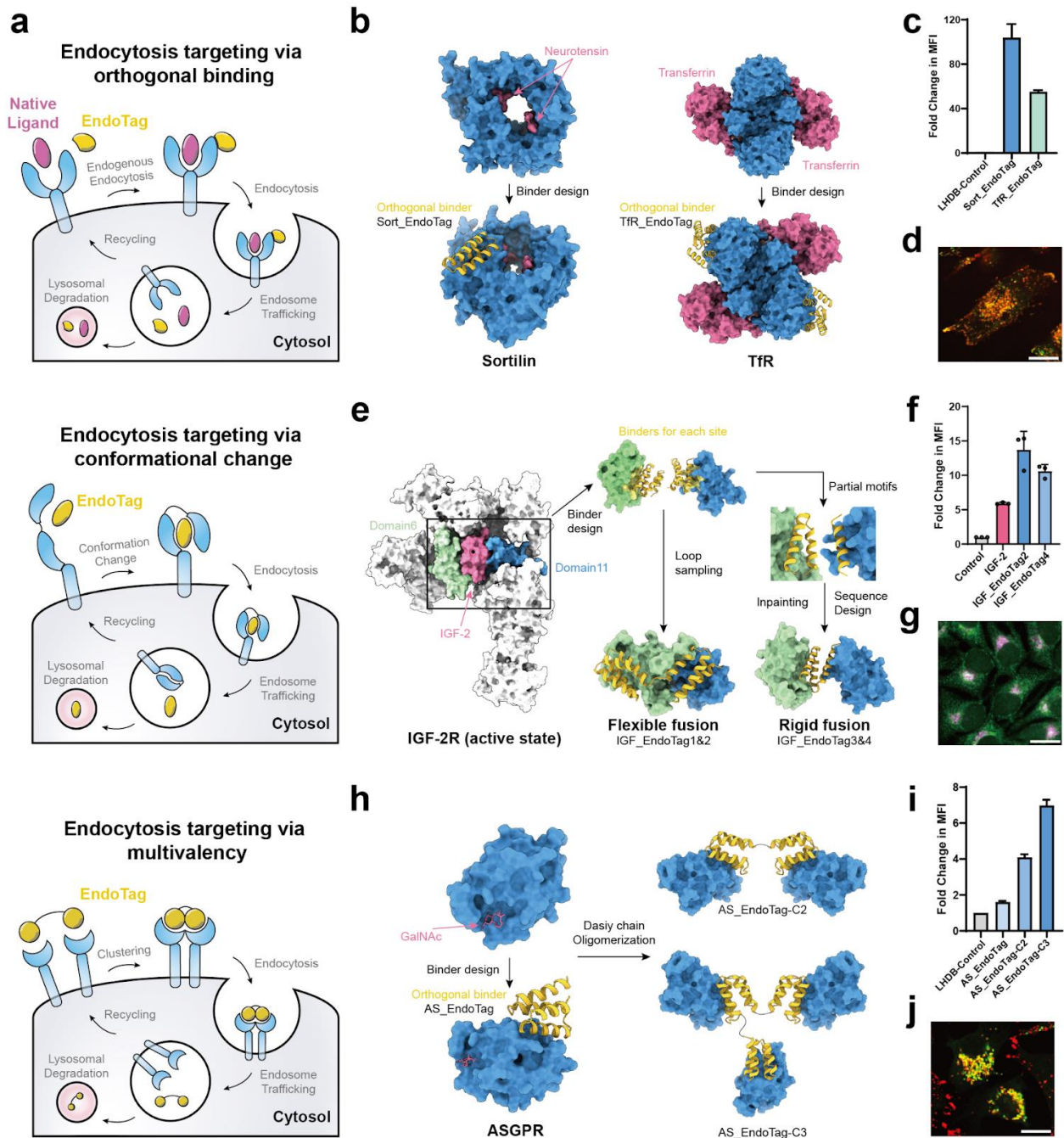
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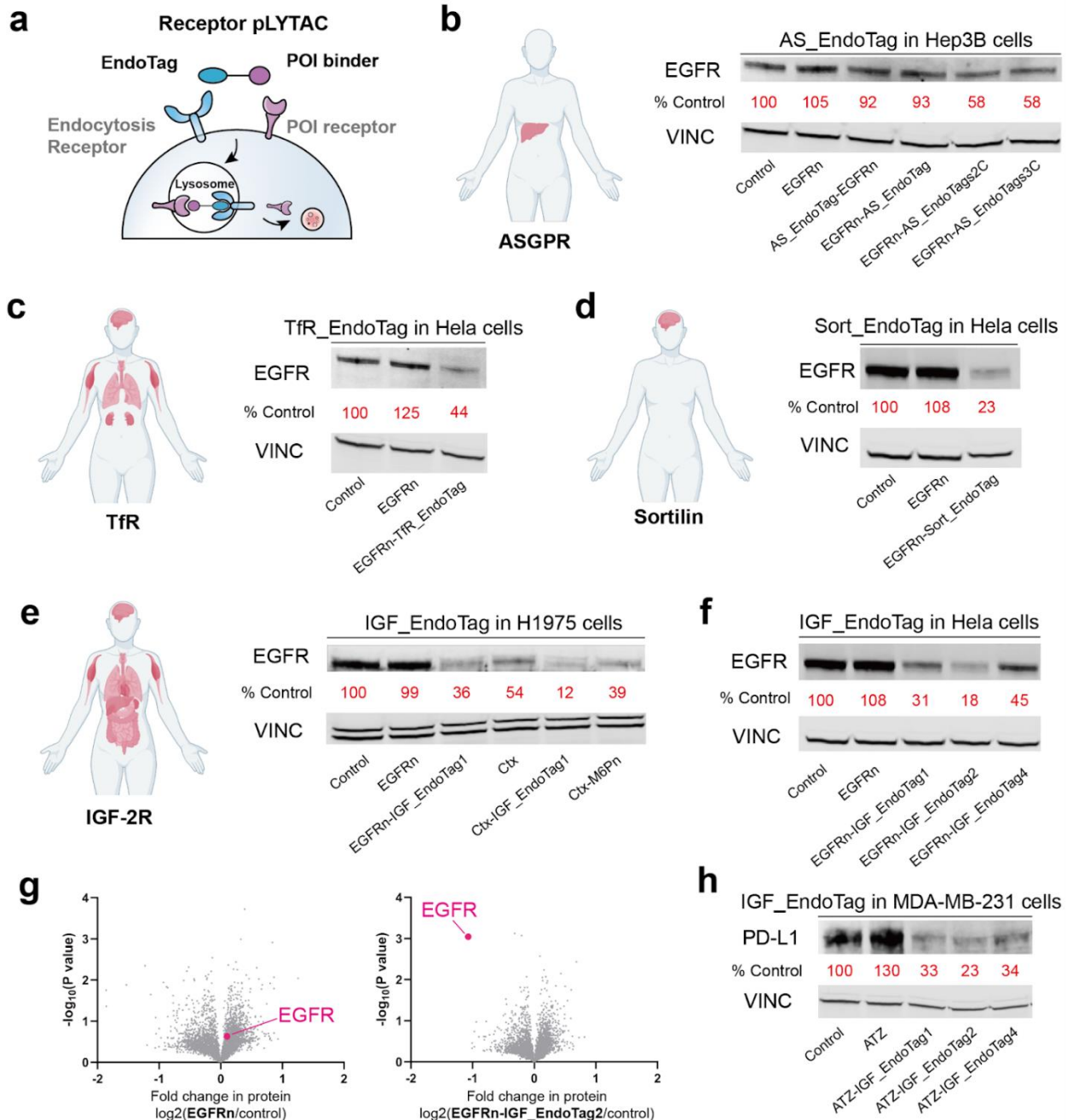
# FIGURES



**Figure 1. Design strategies for endocytosis-triggering EndoTags.**

**a**, Schema of designed endocytosis mechanisms. (top) Design of binding to constitutively cycling receptors at sites that do not overlap with those of natural ligands to avoid competition. (middle) Design of binders that trigger endocytosis by eliciting a conformational change in the receptor. The EndoTag binds at two distinct epitopes on the target and actively triggers the conformational change. (bottom) Designed endocytosis via receptor clustering. The multivalent EndoTag clusters multiple copies of the target receptor and induces endocytosis. **b**, Design

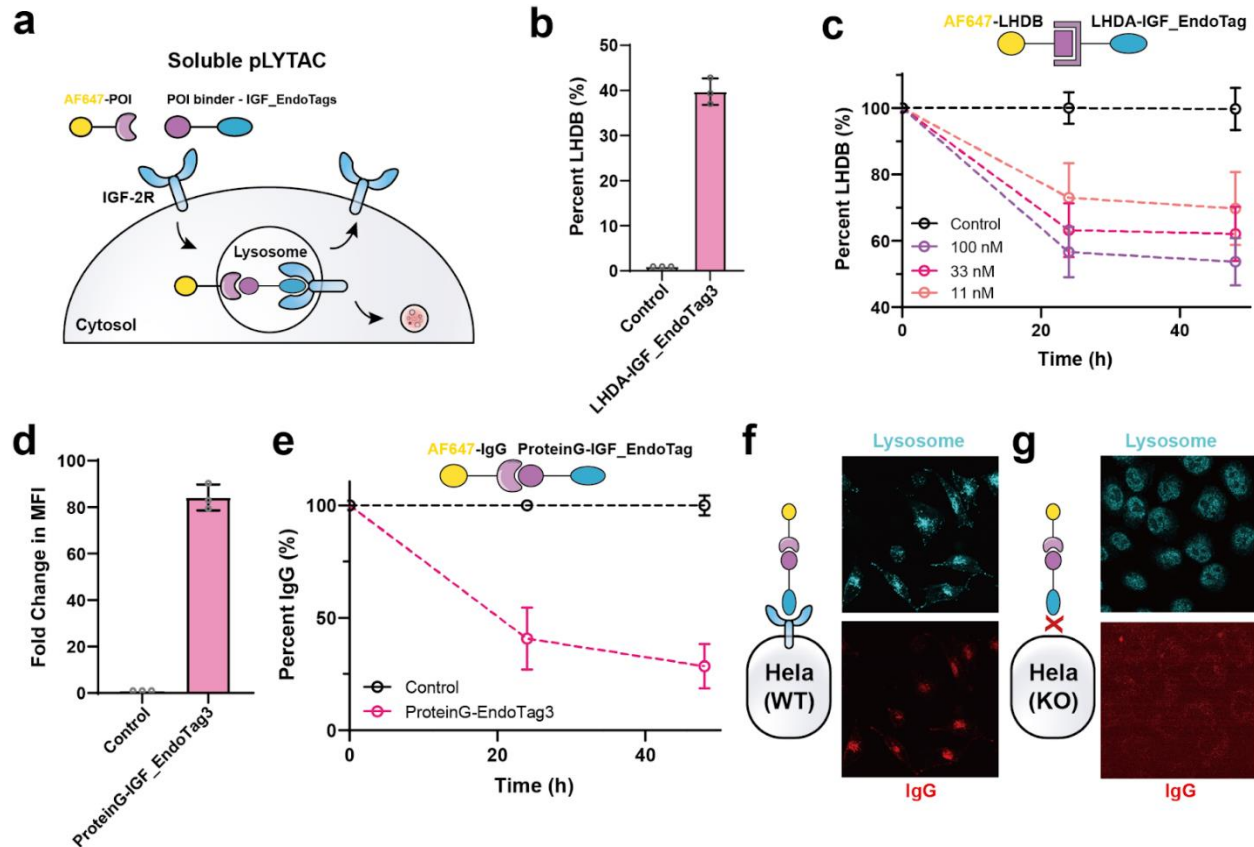
strategy for Sortilin and TfR EndoTags. (left) Starting from the crystal structure of Sortilin<sup>45</sup>, minibinders were designed to bind at a site not overlapping with the native ligand neurotensin. (Right) A designed binder to TfR binds at a site distant from that of transferrin<sup>46</sup>. **c**, Cellular uptake of Sortilin and TfR EndoTags. U-251MG cells were treated with 100nM AF647-labelled Sortilin-EndoTags or TfR-EndoTags for 2h. After washing 3 times, cellular uptake was measured by flow cytometry. The data were normalized with respect to a control group treated with 100nM AF647-labelled LHDB (supposed no endocytosis). **d**, Confocal imaging of Sort\_EndoTag (red) and a lysosomal marker (green). 500nM AF647 labelled Sort\_EndoTag was incubated with U-251MG cells for 24h. The lysosomes were stained with AF488-labelled LysoTracker. **e**, Design strategy for IGF\_EndoTags. Starting from the structure of IGF-2 in complex with IGF-2R, de novo minibinders were generated and screened against the IGF-2 binding sites at IGF-2R domain 6 and domain 11, separately. Individual binders for each domain (D6mb and D11mb) were fused with flexible linkers or a rigid fusion interdomain connection. For flexible fusion, multiple linker lengths and fusion directions were sampled. For rigid fusion, the two major binding helices from D6mb and one major binding helix from D11mb were extracted as starting motifs. With protein Inpainting, geometries and fusion orders were sampled, and ranked based on Rosetta and alphafold2 metrics. **f**, Cellular uptake of IGF\_EndoTags. Jurkat cells were treated with biotinylated 100 nM IGF\_EndoTags or IGF-2, and 33 nM Strapavidin-AF647 for 24h. After washing 3 times, cellular uptake was measured by flow cytometry. The data were normalized with the control group treated with 33 nM Strapavidin-AF647 alone. **g**, Microscopy imaging of IGF\_EndoTag1 (pink) co-localization with lysosomes (green). HeLa cells were incubated with 100nM biotinylated EndoTag1 and 33nM Strapavidin-AF647 for 2h. After washing and fixing the cells, the cells were stained with anti-LAMP2A antibody followed by fluorophore-labeled secondary antibody and DAPI. **h**, Design strategy for ASGPR EndoTags. Based on the crystal structure of ASGPR<sup>47</sup>, binders were designed and then connected with flexible linkers. **i**, Cellular uptake of ASGPR EndoTags. Hep3B cells were treated with 100 nM AF-647 conjugated ASGPR EndoTags for 24h. After washing 3 times, the cellular uptake was measured by flow cytometry. The data were normalized with respect to a control group treated with 100nM AF647-labelled LHDB (supposed no endocytosis). **j**, Confocal imaging of Sort\_EndoTag (red) with lysosome (green). 500nM AF647 labelled Sort\_EndoTag was incubated with Hep3B cells for 24h. The lysosomes were stained with AF488-labelled LysoTracker. For **d,g,j**, the scale bar indicates 20um. For **c,f,i**, the mean values were calculated from triplicates, and error bars represent standard deviations.



**Figure 2. Surface receptor degradation with tissue-specific pLYTACs.**

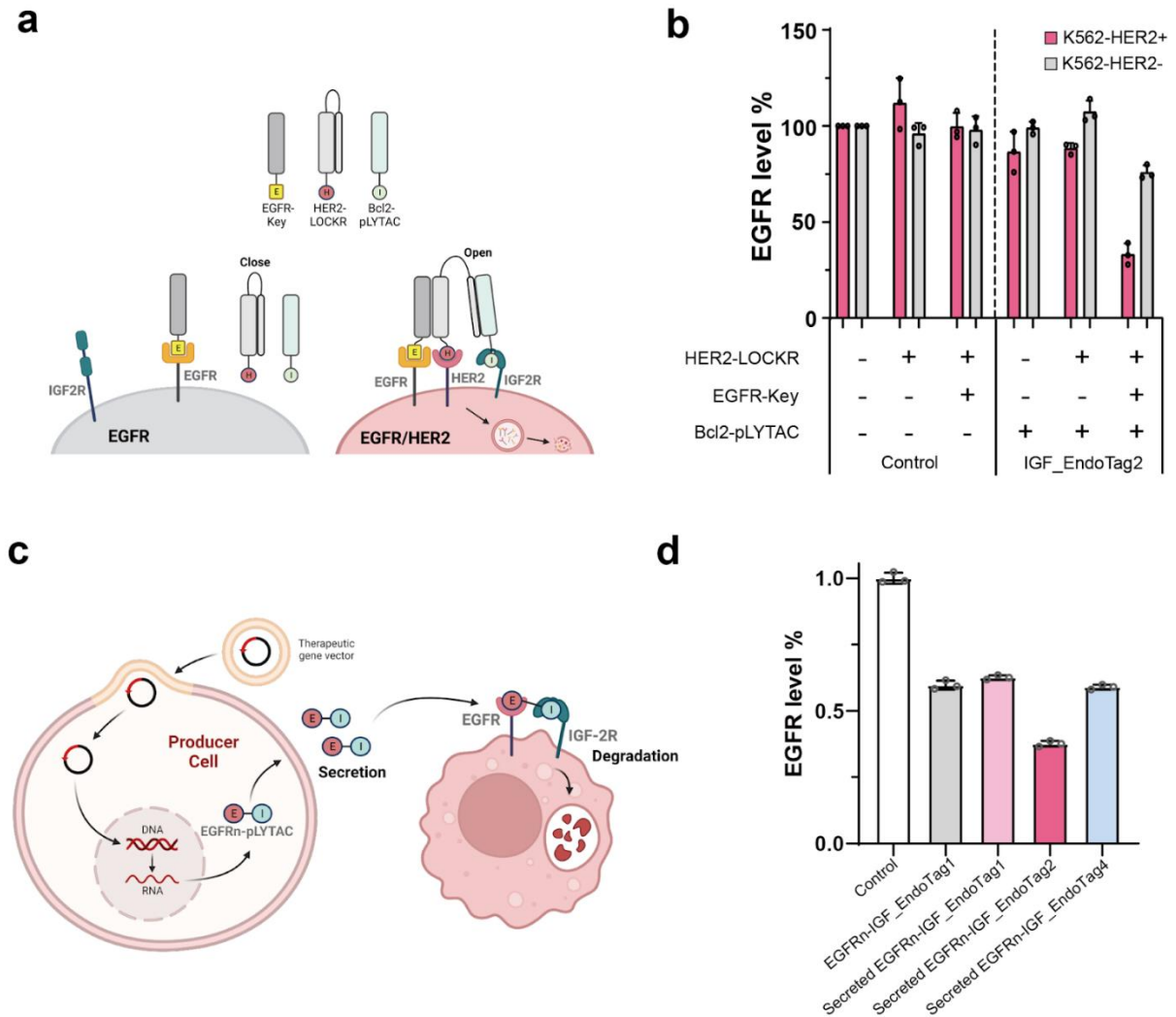
**a**, Schema of tissue-specific pLYTACs for receptor degradation. **b**, ASGPR. Left: Tissue expression of ASGPR. Right: Western blot analysis of total EGFR levels in Hep3B cells after treatment with 200 nM EGFRn or EGFRn-AS\_EndoTag for 48 h. **c**, TfR. Left: Tissue expression of TfR. Right: Western blot analysis of total EGFR levels in Hela cells after treatment with 200 nM EGFRn or EGFRn-TfR\_EndoTag for 48 h. **d**, Sortilin. Left: Tissue expression of Sortilin. Right: Western blot analysis of total EGFR levels in Hela cells after treatment with 200 nM EGFRn or EGFRn-Sort\_EndoTag for 48 h. **e**, IGF-2R. Left: Tissue expression of IGF-2R. Right: Western blot analysis of total EGFR levels in H1975 cells after treatment with 200 nM of EGFRn/CTX with/without the fusion with EndoTag1 or M6Pn for 48 h. **f**, Western blot analysis

of total EGFR levels in HeLa cells after treatment with 200 nM EGFRn or EGFRn-IGF\_EndoTags for 48 h. **g**, Quantitative proteomics analysis of protein abundance in H1975 cells after treatment with EGFRn or EGFRn-IGF\_EndoTag2 for 48h relative to untreated cells. Data are the mean of three biological replicates. **h**, Western blot analysis of total PD-L1 levels in MDA-MB-231 cells after treatment with 200 nM of ATZ or ATZ-pLYTACs for 48 h.



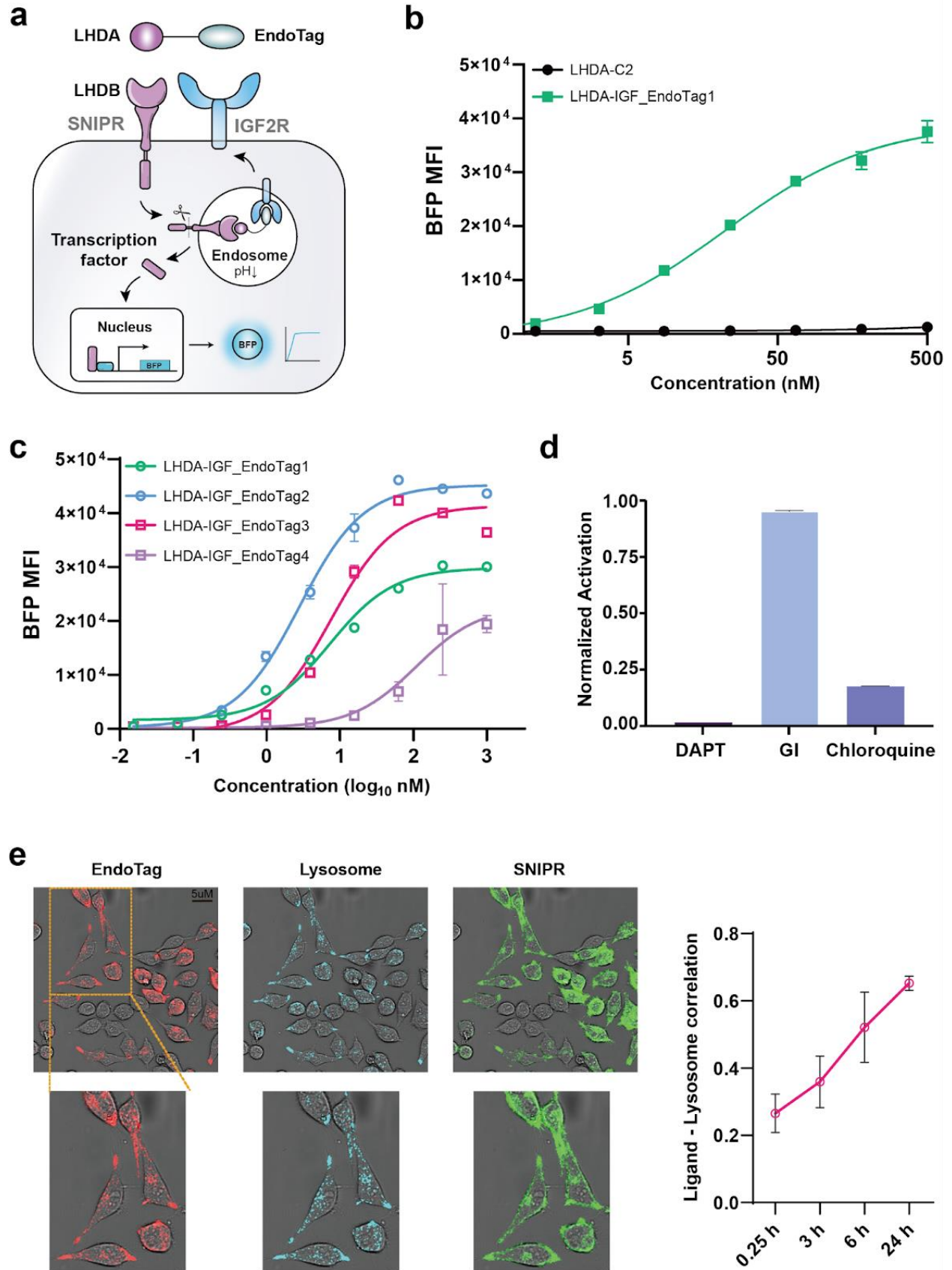
**Figure 3. Clearance of soluble proteins by IGF-2R pLYTACs.**

**a**, Schema of soluble pLYTACs with IGF\_EndoTags. **b**, Cellular uptake of LHDB-AF647 via LHDA-IGF\_EndoTags in Jurkat cells. Cells were incubated with 33nM LHDB-AF647 with/without 1uM LHDA-IGF\_EndoTags for 24h, washed twice with cold PBS and analyzed by flow cytometry. **c**, Remaining supernatant LHDB-AF647 levels in Jurkat cells. Jurkat cells were incubated with 100nM LHDB-AF647 with/without 500nM LHDA-IGF\_EndoTags. At timepoints 24h, 48h, the cells were pelleted down, and supernatant IgG levels were quantified by Neo2 plate reader. The percentage of IgG level was normalized with the IgG alone control group. **d**, Cellular uptake of IgG-AF647 via proteinG-IGF\_EndoTags in K562 cells. Cells were incubated with 33nM IgG-AF647 with/without 1uM proteinG-IGF\_EndoTag3 for 24h, washed twice with cold PBS and analyzed by flow cytometry. The fold change in MFI (mean fluorescence intensity) was calculated by normalizing the IgG-AF647 alone group. **e**, Remaining supernatant IgG-AF647 levels in Jurkat cells. Jurkat cells were incubated with 133nM IgG-AF647 with/without 100nM proteinG-IGF\_EndoTag3. At timepoints 24h, 48h, the cells were pelleted down, and supernatant IgG-AF647 levels were quantified by Neo2 plate reader. The percentage of IgG-AF647 level was normalized with the IgG-AF647 alone control group at each time point. **f**, Confocal imaging of lysosome co-localization of IgG-AF647 with lysosome in HeLa cells. **g**, Confocal imaging of lysosome co-localization of IgG-AF647 with lysosome in HeLa (IGF-2R KO) cells. For **f,g**, the cells were incubated with 200nM IgG-AF647 and 1uM of proteinG-IGF\_EndoTag3 for 24h, washed and stained with LysoTracker.



**Figure 4. Logic gated targeted degradation and locally secretable degraders.**

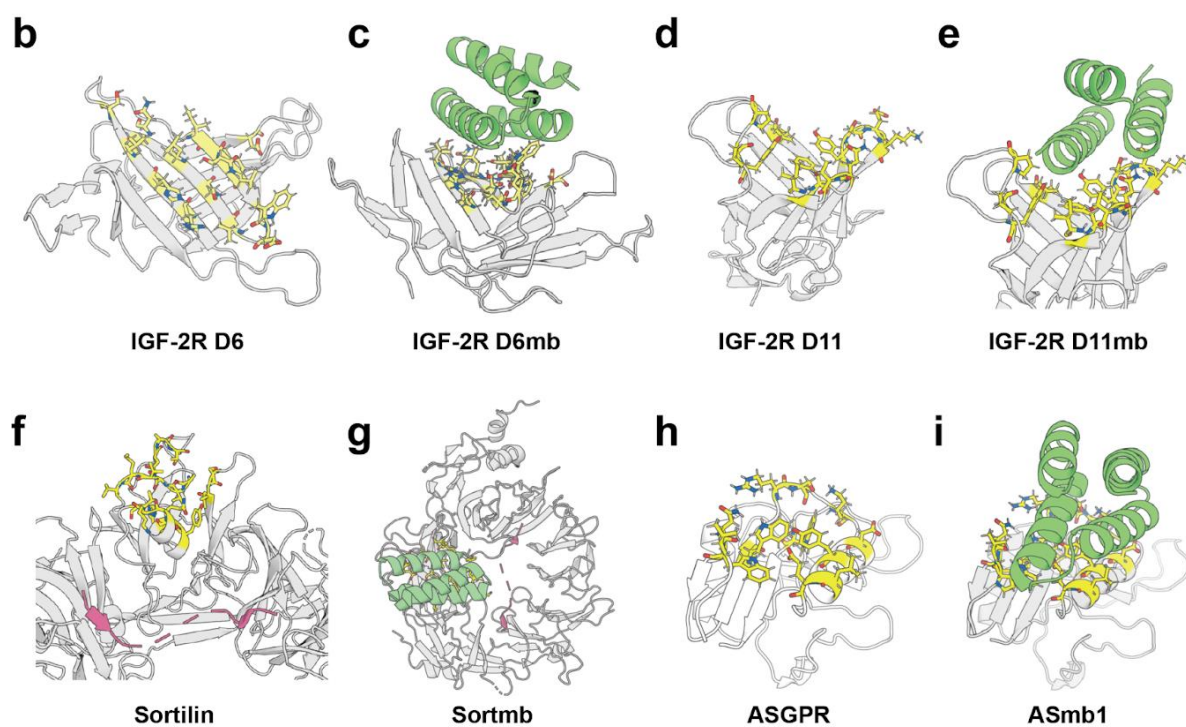
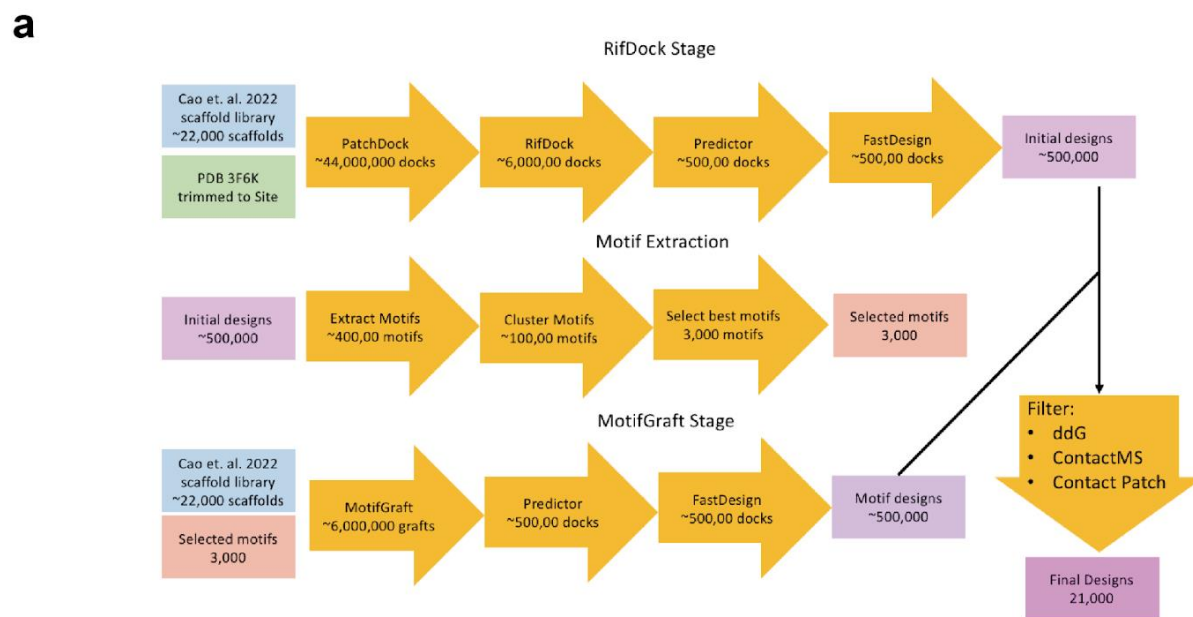
**a**, Schema of AND-gate logic for EGFR degradation in presence of HER2. **b**, Flow cytometry quantification of EGFR level in cell surface. The K562-EGFR or K562-EGFR/HER2 cells were incubated with combinations of 100nM of EGFRn-Key, HER2-LOCKR, and Bcl2-EndoTag2 for 24h. **c**, Schema of secreted EGFR-pLYTAC. **d**, Flow cytometry quantification of EGFR level in cell surface treated with cell supernatant or exogenous EGFRn-IGF\_EndoTag1 for 24h. For the secretion groups, HeLa (IGF-2R KO) cells were transfected with viral vectors encoding the EGFRn-IGF\_EndoTag1 or LHDA-pLYTACs. The supernatant of the cells were collected and incubated with K562-EGFR cells.



**Figure 5. EndoTags enhance signaling.**

**a**, Schematic illustrating designed SNIPR system consisting of an extracellular LHDB protein that recognizes the LHDA ligand, a cleavable membrane proximal domain and an intracellular domain that releases transcription factor which induces expression of blue fluorescent protein (BFP). Upon ligand binding of LHDB to LHDA SNIPR, the IGF\_EndoTag triggers the endocytosis of the complex; signaling activation is quantified by the fluorescence intensity of BFP.

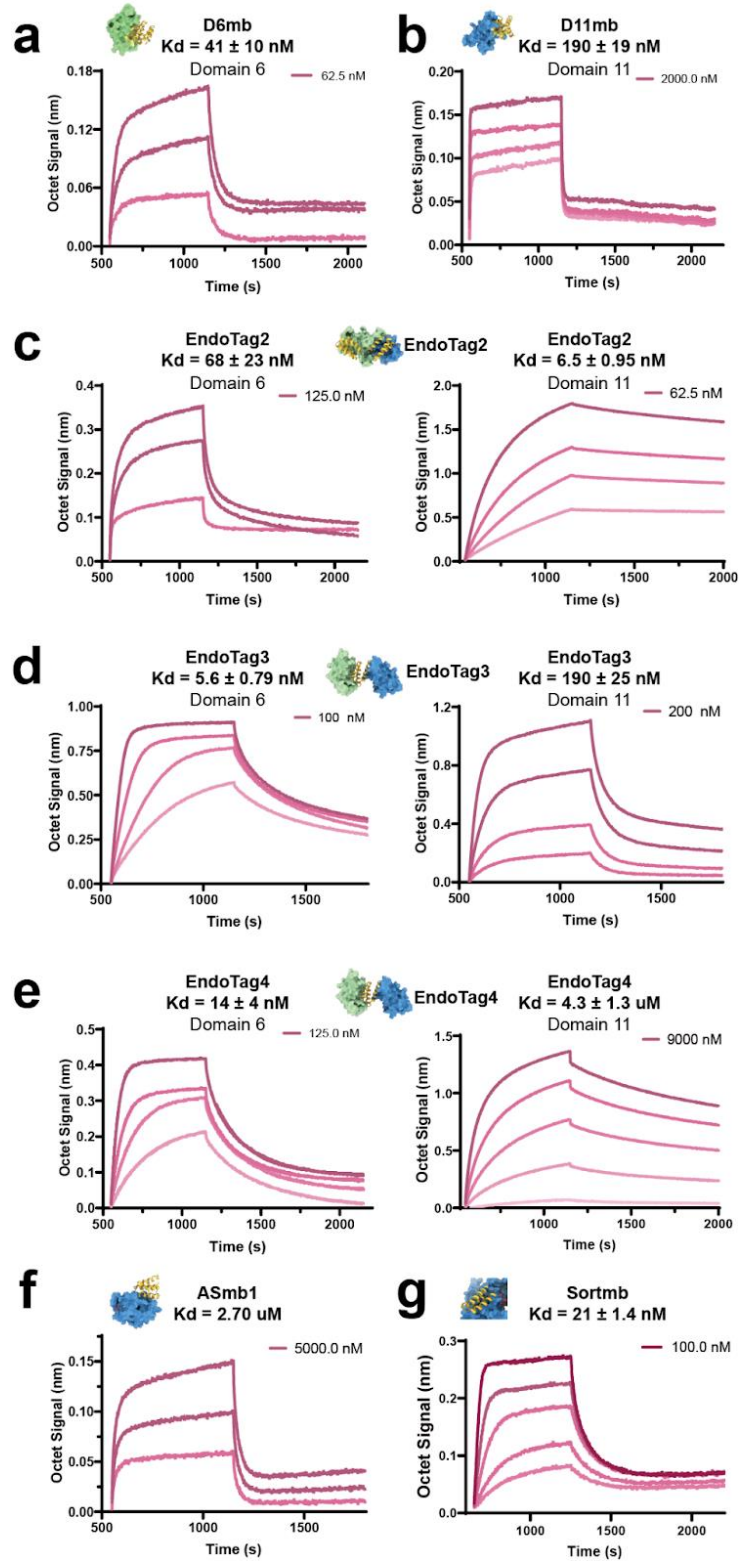
**b**, Activation of an LHDA responsive SNIPR driving a BFP reporter circuit in Jurkat T-cells by a non EndoTag ligand (C2 101A-101A) is much weaker than by a similarly flexibly linked EndoTag containing ligand (IGF-EndoTAG1) (N = 3; +/- SEM). **c**, Dose response curve of signal activation of LHDA fusion with IGF\_EndoTags. For **b&c**, in Jurkat T-cells expressing LHDB SNIPR, the cells were incubated with IGF\_EndoTags at titrated concentration. The corresponding mean fluorescence intensity (MFI) of BFP was recorded. The data was collected with replicates N=3. The error bar represents Standard Error of Mean (SEM). **d**, Relative activation of Jurkat T-cells by IGF-EndoTag1 ligand, in the presence of the chemical inhibitors. Data represents a mean of N=3 measurements normalized to the activation of an inhibitor-free control sample. **e**, Live confocal imaging of lysosome co-localization with the EndoTag ligands and SNIPR receptors at 24 hours. Images were acquired at timepoints [0.25 hours, 3 hours, 6 hours, and 24 hours] for the experiment in (c) and analyzed for colocalization between the labeled EndoTag ligand and lysotracker signal. (N = 4 images per time point with at least 10 cells per image ; +/- SEM).



**Extended Data Figure 1. Binder design strategy and epitope selection.**

**a**, Rifdock-based binder design pipeline. **b**, Selected target region for IGF-2R D6, yellow region highlighted the selected residues for rifdock. **c**, Design model for D6mb in complex with IGF-2R D6. **d**, Selected target region for IGF-2R D11, yellow region highlighted the selected residues for rifdock. **e**, Design model for D11mb in complex with IGF-2R D11. **f**, Selected target region for Sortilin, yellow region highlighted the selected residues for rifdock. **g**, Design model for Sortmb (green) in complex with Sortilin. **h**, Selected target region for ASGPR orthogonal binding sites,

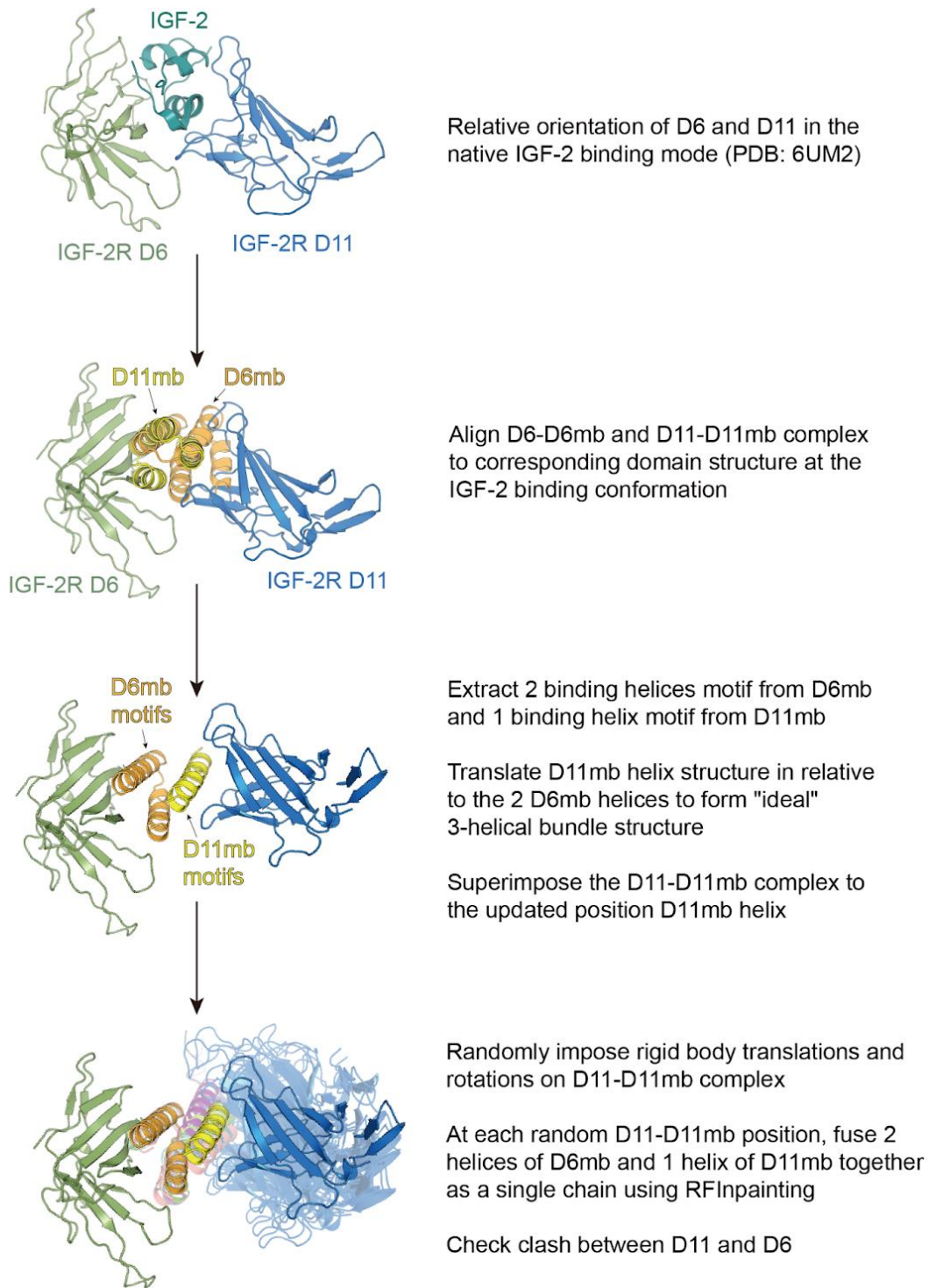
yellow region highlighted the selected residues for r1fdock. **i**, Design model for ASmb1 in complex with ASGPR.



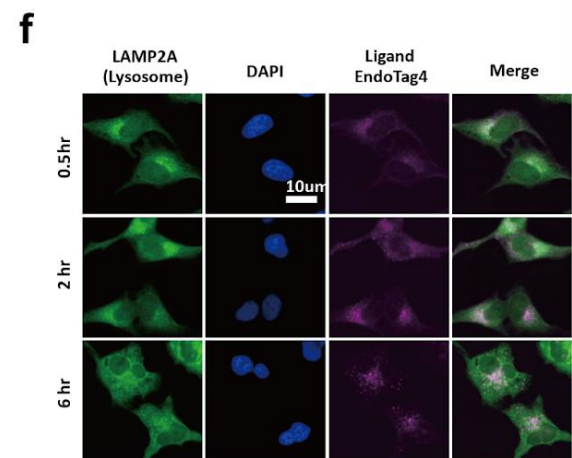
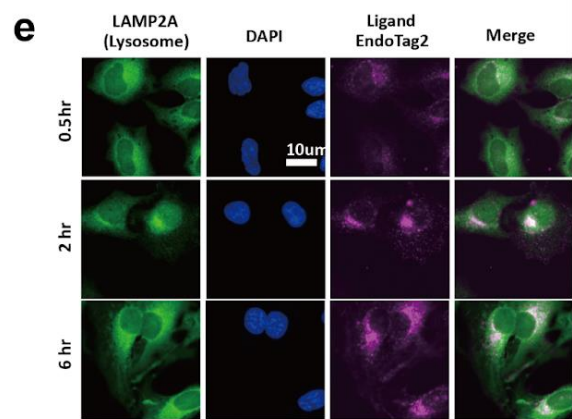
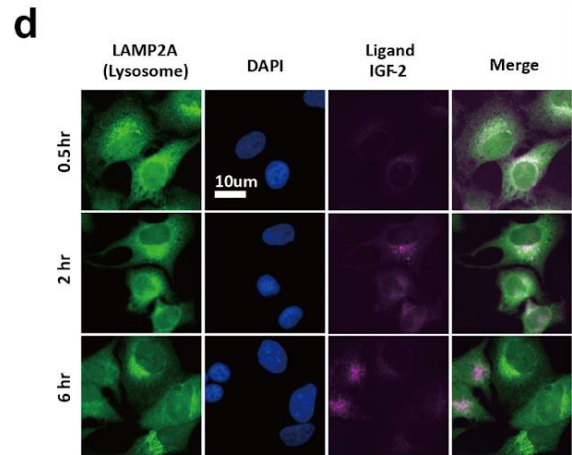
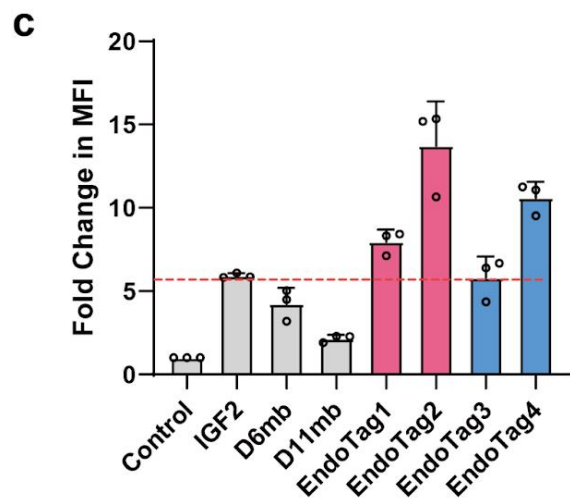
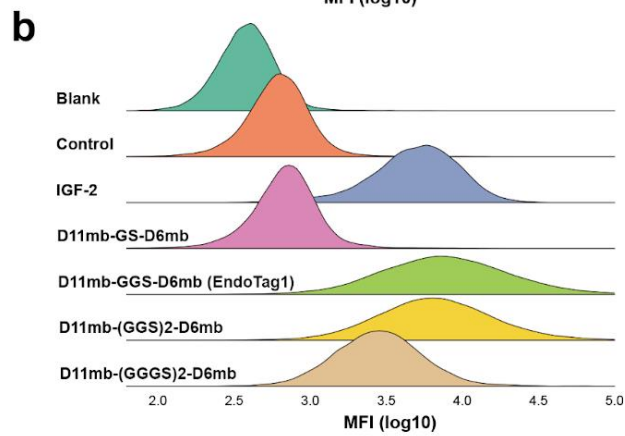
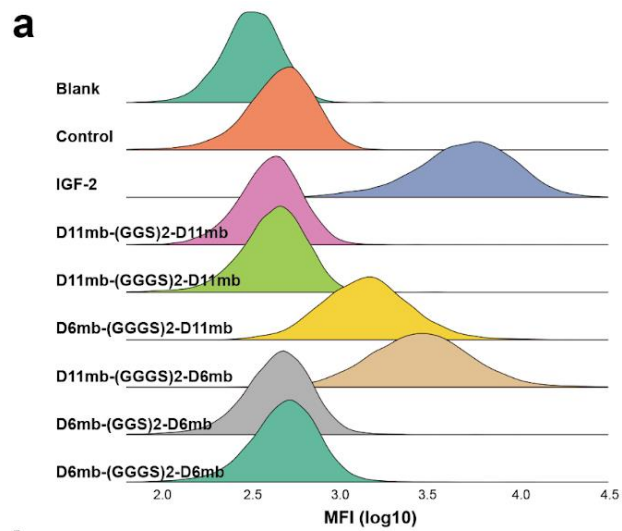
**Extended Data Figure 2. Binding affinity measurement for IGF-2R and ASGPR minibinders.**

**a**, BLI binding affinity measurement for D6mb against IGF-2R D6. **b**, BLI binding affinity measurement for D11mb against IGF-2R D11. **c**, BLI binding affinity measurement for

EndoTag2 against IGF-2R D6 (left) and D11 (right). **d**, BLI binding affinity measurement for EndoTag3 against IGF-2R D6 (left) and D11 (right). **e**, BLI binding affinity measurement for EndoTag4 against IGF-2R D6 (left) and D11 (right). **f**, BLI binding affinity measurement for ASmb1 against ASGPR. **g**, BLI binding affinity measurement for Sortmb against Sortilin. All affinity data was collected by Octet R8 and binding affinity is estimated by Octet ForteBio software package.



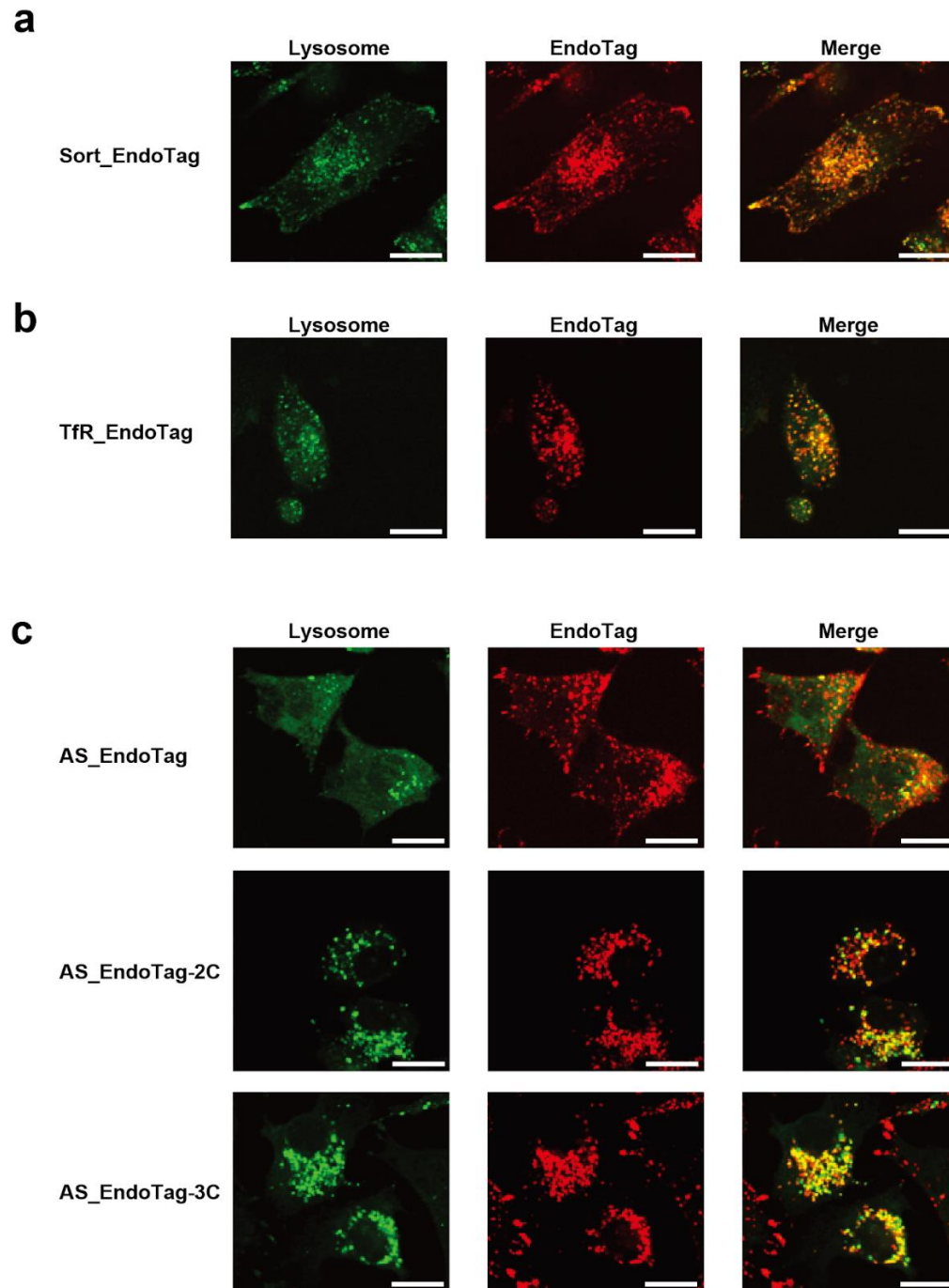
**Extended Data Figure 3. Computational design strategy to make rigid IGF\_EndoTags (EndoTag3 and EndoTag4).**



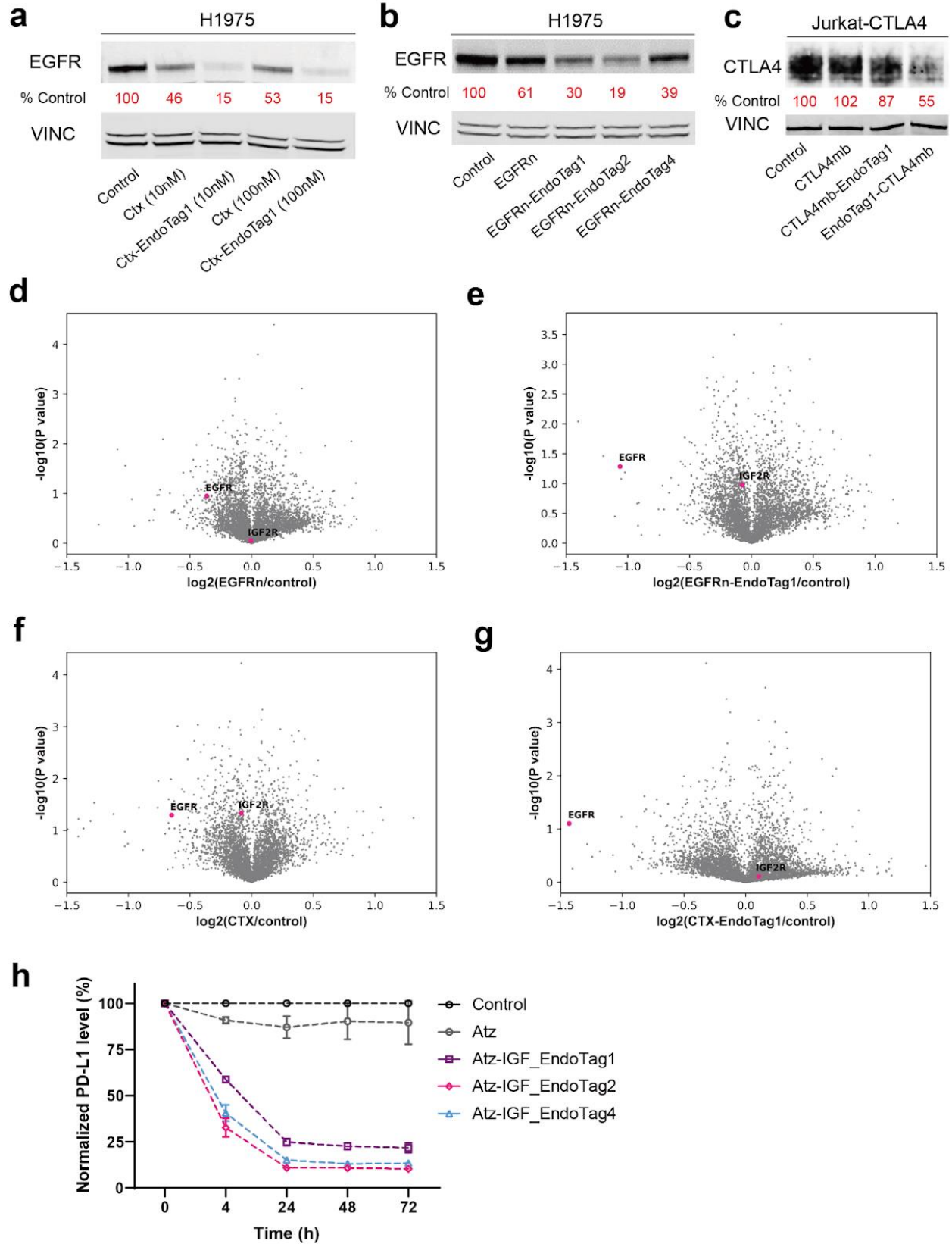
**Extended Data Figure 4. Cellular uptake evaluation IGF\_EndoTags.**

**a**, Cellular uptake comparison between homodimer and heterodimer fusion of D6mb and D11mb. **b**, Cellular uptake comparison of linker length of D11mb-D6mb fusion with various lengths of GS linkers in the middle. **c**, Cellular uptake of IGF\_EndoTags. Jurkat cells were

treated with biotinylated 100 nM IGF\_EndoTags or IGF-2, and 33 nM Strapavidin-AF647 for 24h. After washing 3 times, the cellular uptake was measured by flow cytometry. The data were normalized with the control group treated with 33 nM Strapavidin-AF647 alone. The data was collected with N=3. **d**, Fluorescence Microscopy imaging of IGF-2 co-localized with lysosomal. **e**, Fluorescence Microscopy imaging of EndoTag2 co-localized with lysosomal. **f**, Fluorescence Microscopy imaging of EndoTag4 co-localized with lysosomal. For **a**, and **b**, 200nM biotinylated fusion proteins were incubated with 50 nM of Strapavidin-AF647 and incubated with Jurkat cells for 24h. After wash 3 times with cold PBS, the cellular uptake was measured by flow cytometry. For **d-f**, HeLa cells were incubated with 100nM of biotinylated IGF-2, EndoTag2 or EndoTag4 for various time length. After cells were washed twice and fixed, they were stained with anti-LAMP2A antibody followed by goat secondary anti-IgG Alexa Fluo 488 antibody and DAPI. Epifluorescence imaging was conducted on a Yokogawa CSU-X1 microscope.

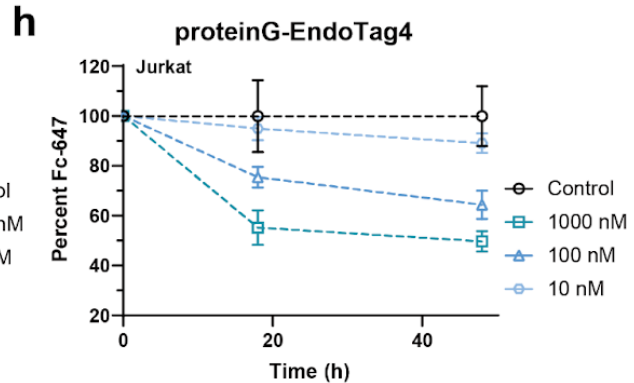
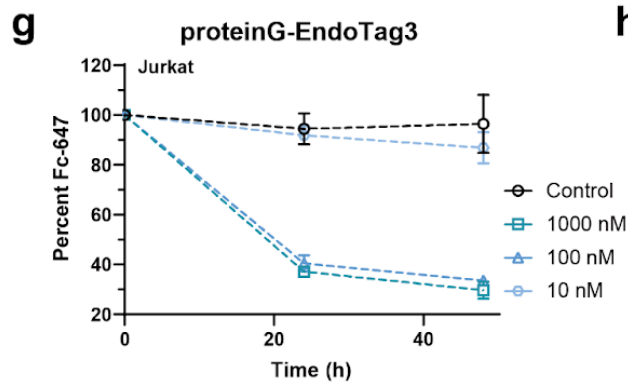
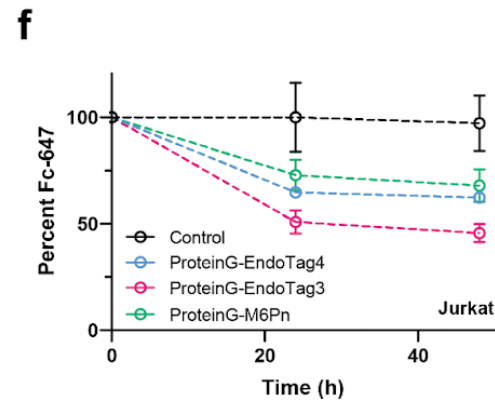
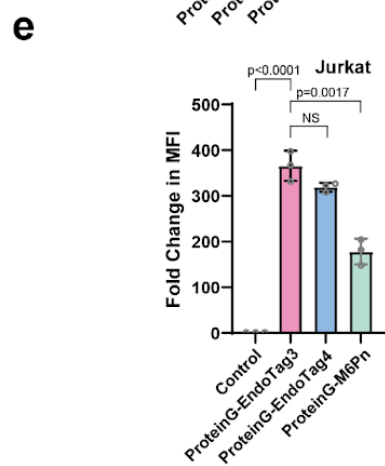
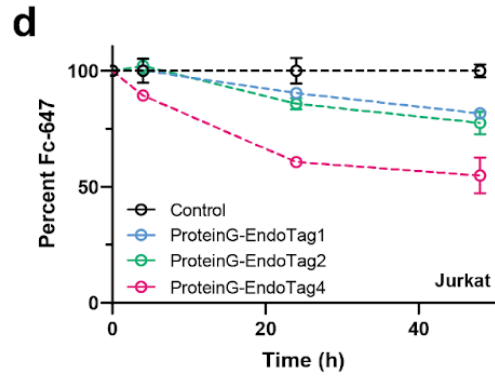
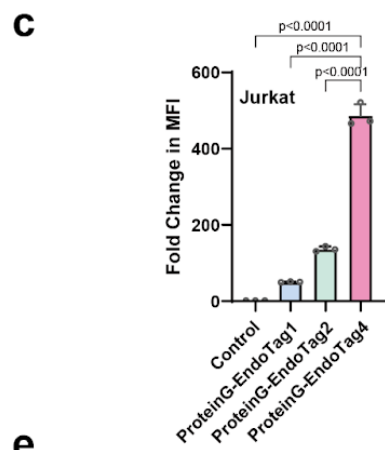
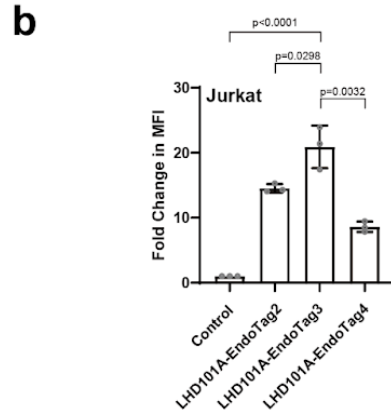
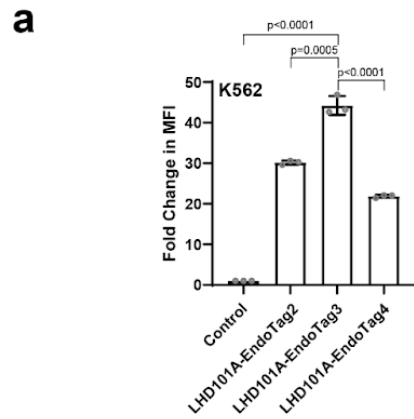


**Extended Data Figure 5. Confocal imaging of co-localization of EndoTag with lysosome.**  
**a**, 500nM Sort\_EndoTag was incubated with U-251MG cells for 24h. **b**, 500nM TfR\_EndoTag was incubated with U-251MG cells for 24h. **c**, 500nM AS\_EndoTags were incubated with Hep3B cells for 24h. For **a-c**, the lysosome was labelled by AF488-Lysotracker. All EndoTags were labelled with AF647.



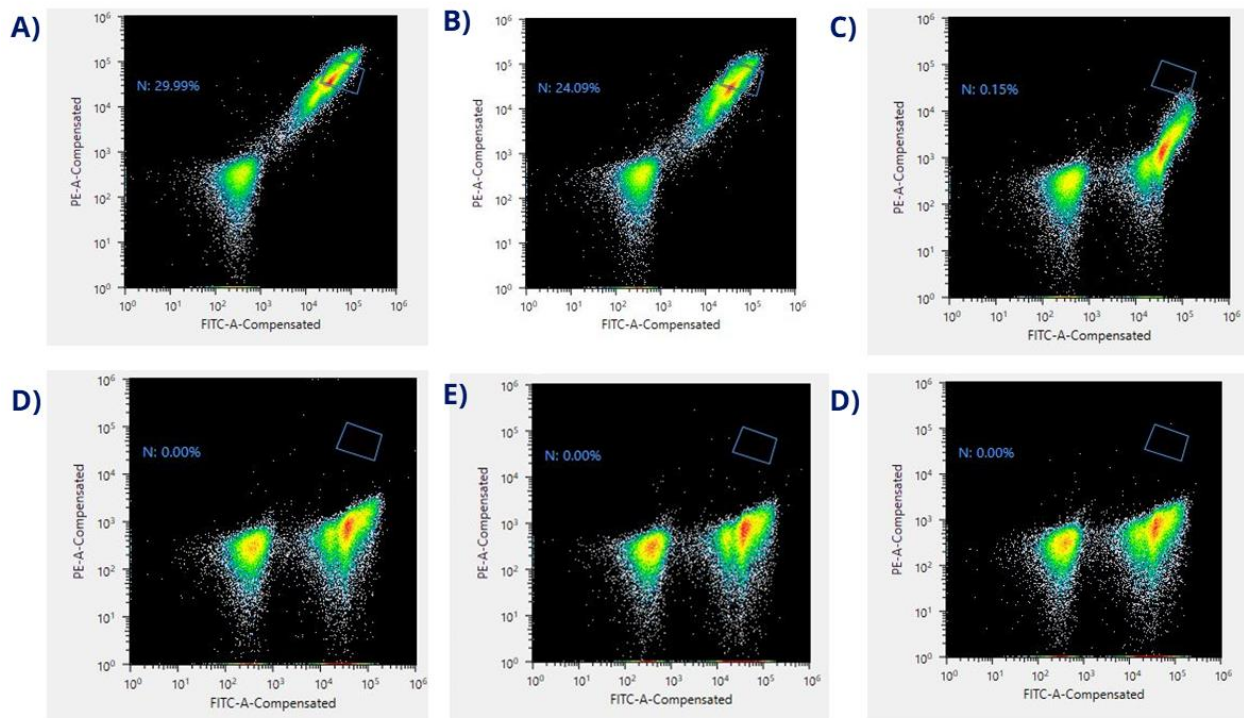
Extended Data Figure 6. Receptor degradation with EndoTags.

**a**, Levels of EGFR after treatment with 10 nM or 100nM CTX-M6P or CTX-IGF\_Endotag1 in H1975 cells for 48 h. **b**, Levels of EGFR after treatment with 100nM EGFRn or EGFRn-IGF\_EndoTags in H1975 cells for 48 h. **c**, Levels of CTLA4 with 200nM of CTLA4mb or CTLA4mb-IGF\_EndoTag1 in Jurkat-CTLA4 cells after treatment for 3h. **d**, Fold change in abundance of EGFR with treatment of EGFRn compared with control. **e**, Fold change in abundance of EGFR with treatment of EGFRn-IGF\_EndoTag1 compared with control. **f**, Fold change in abundance of EGFR with treatment of CTX compared with control. **g**, Fold change in abundance of EGFR with treatment of CTX-IGF\_Endotag1 compared with control. **h**, Flow cytometry analysis of surface PD-L1 levels in MDA-MB-231 cells after treatment with 200nM ATZ or ATZ-pLYTACs. MFI was normalized by the PD-L1 level of untreated groups. For **d-g**, the proteomic data was collected in H1975 cells with the treatment 100nM of corresponding reagents for 48h. All data was replicated with N=2.



### Extended Data Figure 7. Clearance of soluble proteins with EndoTags.

**a**, LHDB-AF647 cellular uptake ability comparison among flexible and rigid LHDA-IGF\_EndoTags in K562 cells. **b**, LHDB-AF647 cellular uptake ability comparison among flexible and rigid LHDA-IGF\_EndoTags in Jurkat cells. **c**, IgG-AF647 cellular uptake ability comparison between flexible and rigid designs. **d**, Quantitative clearance of IgG-AF647 in cell media comparison between flexible and rigid designs. **e**, IgG-AF647 cellular uptake ability comparison between pLYTACs and M6Pn. **f**, Quantitative clearance of IgG-AF647 in cell media comparison between pLYTACs and M6Pn. **g**, Quantitative clearance of IgG-AF647 in cell media with titrated proteinG-EndoTag3. **h**, Quantitative clearance of IgG-AF647 in cell media with titrated proteinG-EndoTag4. For **a,b**, cells were incubated with 100nM LHDB-biotin + 33nM Strapavidin-AF647 with/wihtout 500nM LHDB-pLYTACs for 48h, washed twice with cold PBS and analyzed by flow cytometry. The fold change in MFI (mean fluorescence intensity) was calculated by normalizing the LHDB-AF647 alone group. For **c,e**, cells were incubated with 33nM IgG-AF647 with/wihtout 1uM proteinG-IGF\_EndoTags for 24h, washed twice with cold PBS and analyzed by flow cytometry. The fold change in MFI (mean fluorescence intensity) was calculated by normalizing the IgG-AF647 alone group. For **d,f,g,h**, cells were incubated with 33nM IgG-AF647 with/wihtout proteinG-IGF\_EndoTags. At timepoints 24h, 48h, the cells were pelleted down, and supernatant IgG-AF647 levels were quantified by Neo2 plate reader. The percentage of IgG-AF647 level was normalized with the IgG-AF647 alone control group. Data shown above are collected with biological replicates with N=3.



### Extended Data Figure 8. Epitope verification using N-linked glycan screen of computational designed Sortilin binder sortmb using Yeast Display.

**a**, 400 nM human ECD SORT-1. **b**, 400 nM mouse ECD SORT-1. **c**, 1000 nM NN-0975. **d**, 1000 nM NN-0979. **e**, 1000 nM NN-0981. **f**, 1000 nM NN-0977.

<b>Name</b>	<b>Target</b>	<b>Kd (M)</b>
D6mb	IGF-2R D6	4.10E-08
D11mb	IGF-2R D11	1.90E-07
Flex24	IGF-2R D6	6.80E-08
Flex24	IGF-2R D11	6.50E-09
Rigid1	IGF-2R D6	5.60E-09
Rigid1	IGF-2R D11	1.90E-07
Rigid4	IGF-2R D6	1.40E-08
Rigid4	IGF-2R D11	4.30E-06
ASmb1	ASGPR	2.70E-06
TfRmb	TfR	2.00E-08
Sortmb	Sortilin	2.10E-08

**Table 1. Binding affinity of EndoTag binders.**

All affinity data was collected by Octet R8 and binding affinity is estimated by Octet ForteBio software package.

## **VITA**

Buwei is PhD student from Prof. David Baker lab and majored in Bioengineering at University of Washington. He obtained his Master degree in Biomedical Engineering at Johns Hopkins university and his Bachelor degree in Pharmacy at Zhejiang University.