



## Research article

## Family-wide analysis of integrin structures predicted by AlphaFold2

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## ARTICLE INFO

## Keywords:

Integrin  
AlphaFold2  
Structure prediction  
Conformational change

## ABSTRACT

Recent advances in protein structure prediction using AlphaFold2, known for its high efficiency and accuracy, have opened new avenues for comprehensive analysis of all structures within a single protein family. In this study, we evaluated the capabilities of AlphaFold2 in analyzing integrin structures. Integrins are heterodimeric cell surface receptors composed of a combination of 18  $\alpha$  and 8  $\beta$  subunits, resulting in a family of 24 different members. Both  $\alpha$  and  $\beta$  subunits consist of a large extracellular domain, a short transmembrane domain, and typically, a short cytoplasmic tail. Integrins play a pivotal role in a wide range of cellular functions by recognizing diverse ligands. Despite significant advances in integrin structural studies in recent decades, high-resolution structures have only been determined for a limited subsets of integrin members, thus limiting our understanding of the entire integrin family. Here, we first analyzed the single-chain structures of 18  $\alpha$  and 8  $\beta$  integrins in the AlphaFold2 protein structure database. We then employed the newly developed AlphaFold2-multimer program to predict the  $\alpha/\beta$  heterodimer structures of all 24 human integrins. The predicted structures show a high level of accuracy for the subdomains of both  $\alpha$  and  $\beta$  subunits, offering high-resolution structure insights for all integrin heterodimers. Our comprehensive structural analysis of the entire integrin family unveils a potentially diverse range of conformations among the 24 members, providing a valuable structure database for studies related to integrin structure and function. We further discussed the potential applications and limitations of the AlphaFold2-derived integrin structures.

## 1. Introduction

Integrins are cell surface receptors that recognize a variety of extracellular or cell surface ligands, enabling communication between the cell's interior and exterior [1]. The human integrin family consists of 24 members, formed through the combination of 18  $\alpha$  and 8  $\beta$  subunits (Fig. 1). These 24  $\alpha/\beta$  integrin heterodimers are either widely distributed or specifically expressed in particular cell types. As a result, they serve universal or specialized functions in cellular processes related to cell adhesion and migration. Based on ligand or cell specificity, integrins can be categorized into subfamilies, including RGD (Arg-Gly-Asp) receptors, collagen receptors, laminin receptors, and leukocyte-specific receptors [1]. Integrins play pivotal roles in various diseases such as thrombosis, inflammation, and cancer, rendering them attractive therapeutic targets by small molecule or antibody inhibitors [2–4]. Since their discovery in the early 1980s, research into integrin structure and function has been a continuous area of interest [5].

The  $\alpha$  and  $\beta$  subunits of integrin are composed of multiple

subdomains. The  $\alpha$  subunit contains  $\beta$ -propeller, thigh, calf-1, calf-2, transmembrane (TM), and cytoplasmic tail (CT) domains (Fig. 1A-C). The  $\beta$  subunit comprises  $\beta$ I, hybrid, PSI, I-EGF 1-4,  $\beta$ -tail, TM, and CT domains (Fig. 1A-C). A subclass of  $\alpha$  integrins has an extra  $\alpha$ I domain inserted into the  $\beta$ -propeller domain (Fig. 1D-F). In integrins without the  $\alpha$ I domain, the  $\alpha$   $\beta$ -propeller and  $\beta$   $\beta$ I domains combine to form the ligand binding site (Fig. 1A-C). In contrast, for  $\alpha$ I-containing integrins, the  $\alpha$ I domain is responsible for ligand binding (Fig. 1D-F). Integrin ectodomains can also be divided into the headpiece (containing the head and upper legs) and lower leg domains (Fig. 1C). In the past few decades, structural studies of integrins have unveiled a conformation-dependent activation and ligand binding mechanism, involving transitions among at least three conformational states [6,7]. The bent conformation with closed headpiece represents the resting state of integrin (Fig. 1A, D), while the extended closed headpiece and extended open headpiece represent the intermediate and high-affinity active states, respectively (Fig. 1B-C, E-F). The conformational transition of integrin can be initiated by the binding of intracellular activators, including talin and

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```
#!/bin/bash
#SBATCH --job-name=alphafold_test
#SBATCH --ntasks=8
#SBATCH --mem=100gb
#SBATCH --time=48:00:00
#SBATCH --output=%x-%j.out
#SBATCH --gres=gpu:1
#SBATCH --partition=gpu
#SBATCH --partition=bigmem
module load alphafold/2.1.2
export NVIDIA_VISIBLE_DEVICES=$CUDA_VISIBLE_DEVICES
run_alphafold.sh -d $DOWNLOAD_DIR -f /scratch/.../alphatest/
integrin_heterodimer_amino_acid_sequence.fasta -t 2023-01-01 -o
/scratch/.../alphatest/ -m multimer
```

Typically, one GPU (`--gres=gpu:1`) and 100 GB memory (`--mem=100gb`) was requested to run AlphaFold2. The maximum job running time was set to 48 h (`--time=48:00:00`). To run AlphaFold2-Multimer for structure prediction of integrin heterodimers, an input fasta file containing the sequences of both integrin  $\alpha$  and  $\beta$  subunits was provided. The multimer prediction function was enabled with command “`--model_preset (-m)=multimer`”. Full length or extracellular domain structures of integrin heterodimers without signal peptides were predicted with or without templates by setting the parameter of “`--max_template_date (-t)=2000-05-14`” or “`--max_template_date (-t)=2023-01-01`”. For integrin  $\alpha_6\beta_4$  structure prediction, the large cytoplasmic tail of  $\beta_4$  was truncated after KGRDV to simplify the prediction. The top ranked models were selected for further analysis.

### 2.3. Comparison of AlphaFold2 predicted integrin structures

The single chain  $\alpha$  integrin structures downloaded from AlphaFold2 database were superimposed based on the  $\alpha_{IIb}$  calf-2 domain using the “super” command in PyMOL. The single chain  $\beta$  integrin structures downloaded from AlphaFold2 database were superimposed based on the  $\beta_3$   $\beta_1$  domain using the super command in PyMOL. The experimentally determined structures for  $\alpha_{IIb}$  (PDB 3FCS),  $\alpha_V$  (PDB 4G1E),  $\alpha_5$  (PDB 7NXD), and  $\alpha_X$  (PDB 4NEH) were superimposed onto the predicted corresponding structures. The experimentally determined structures for  $\beta_3$  (PDB 3FCS),  $\beta_1$  (PDB 7NXD), and  $\beta_2$  (PDB 4NEH) were superimposed onto the predicted structures accordingly. The integrin heterodimer structures predicted by AlphaFold2-multimer with or without TM-CT domains were superimposed onto the calf-2 domain of  $\alpha_{IIb}$  in PyMOL. For structure comparison of integrin TM-CT heterodimers, the structures were superimposed based on the  $\alpha_{IIb}$  TM domain. The aligned structures were individually oriented to position them perpendicularly to the cell membrane.

### 2.4. DNA constructs

The  $\alpha_5$  with C-terminal EGFP tag ( $\alpha_5$ -EGFP) was a gift from Rick Horwitz (Addgene plasmid #15238; <http://n2t.net/addgene:15238>; RRID:Addgene\_15238) [46]. The  $\alpha_9$  with C-terminal EGFP tag ( $\alpha_9$ -EGFP) was a gift from Dean Sheppard (Addgene plasmid #13600; <http://n2t.net/addgene:13600>; RRID:Addgene\_13600). The  $\alpha_3$ ,  $\alpha_7$ , and  $\alpha_{10}$  integrins were cloned into pEGFP-N3 vector using the *SalI* and *KpnI* restriction sites following the standard molecular cloning protocol. A pair of primers were designed for introducing N839Q mutation into the  $\alpha_{10}$ -EGFP plasmid, forward primer: 5' gaacagaaggaaatgcttacacagcagcctgagctcatcttc 3'; reverse primer: 5' gaagatgagactcagcctgctgtgtaagcattttctctgttc 3'. The  $\alpha_{10}$ -N839Q mutation was generated by QuickChange mutagenesis kit following the instruction (cat# 200517–5, Agilent Technologies, Inc.). All DNA constructs were identified by sanger sequencing service provided by Retrogen, Inc.

### 2.5. Flow cytometry analysis of LIBS (Ligand Induced Binding Site) mAb binding

The LIBS rat mAb 9EG7 (cat# 553715, BD Biosciences) was used to measure the conformational extension of  $\beta_1$  integrin. The mouse mAb MAR4 (cat# 555442, BD Biosciences) was used to measure total surface expression of  $\beta_1$  integrin. The HEK293T cells were grown in complete DMEM (cat# 10-017-CV, Corning) supplemented with 10% fetal bovine serum (FBS) (cat# F2442, Sigma-Aldrich). Cells were maintained in a 37 °C incubator with 5% CO<sub>2</sub>. Flow cytometry analysis of integrin expression and LIBS mAb binding were as described previously [47]. In brief, HEK293T cells were transfected with EGFP-tagged  $\alpha$  integrin constructs plus  $\beta_1$  integrin. 48 h post-transfection, the cells were detached, washed, and resuspended in HBSGB buffer (25 mM HEPES pH 7.4, 150 mM NaCl, 2.75 mM glucose, 0.5% BSA) containing 1 mM Ca<sup>2+</sup>/Mg<sup>2+</sup> or 0.1 mM Ca<sup>2+</sup> plus 2 mM Mn<sup>2+</sup>. Cells were incubated with 5  $\mu$ g/ml of either 9EG7 mAb or MAR4 for 15 mins, followed by additional 15 min incubation with 10  $\mu$ g/ml Alexa Fluor 647-conjugated goat anti-rat IgG (cat# A-21247, Invitrogen) or goat anti-mouse IgG (cat # A-21235, Invitrogen). Surface binding of mAb was measured by a BD Accuri™ C6 (BD Biosciences). The results were presented as a normalized mean fluorescence intensity (MFI) by calculating the MFI of 9EG7 binding (recognizing extended  $\beta_1$ ) as a percentage of the MFI of MAR4 binding (recognizing total  $\beta_1$ ). The plot was generated with Prism 9 software.

### 2.6. Data availability

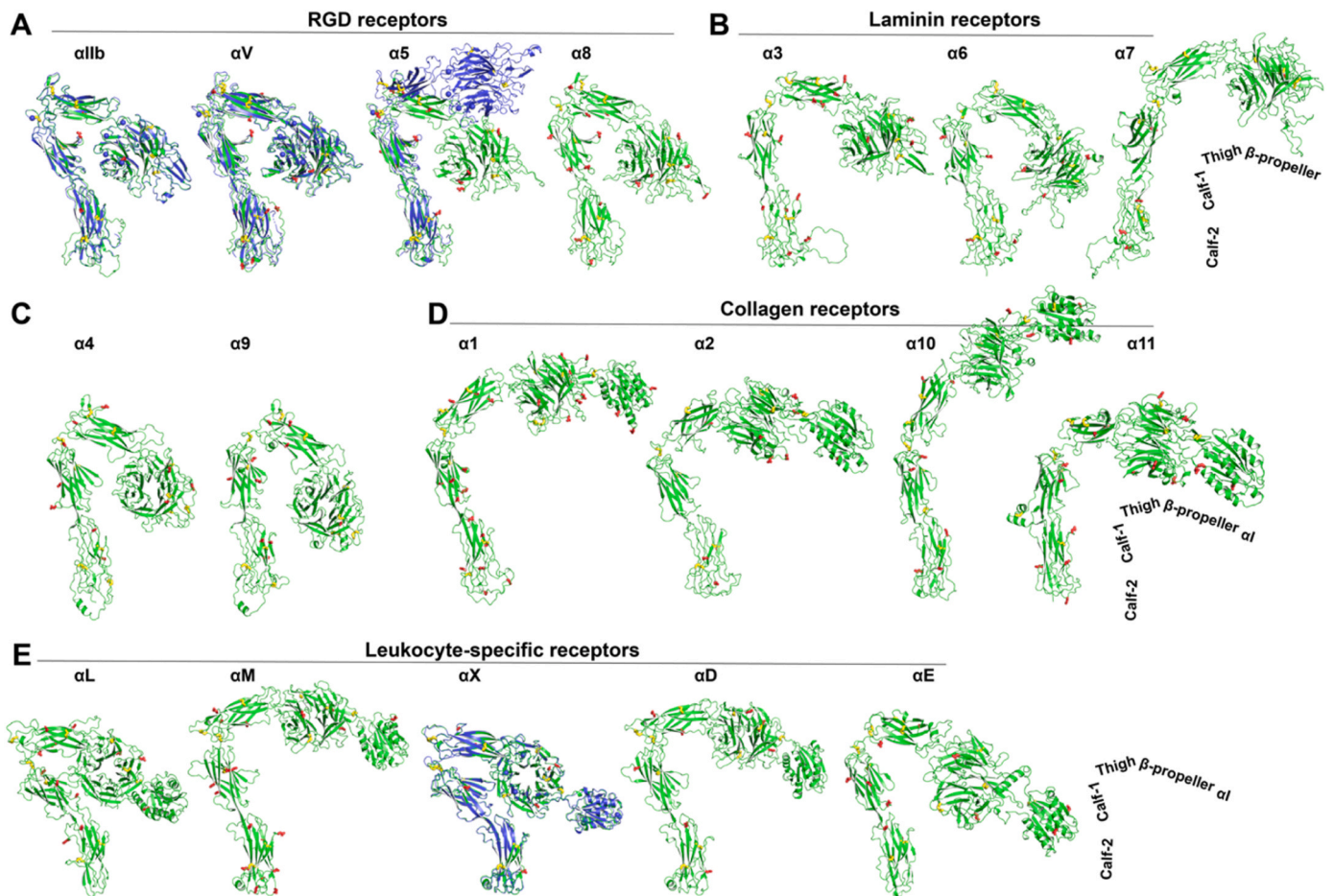
The datasets generated during and/or analyzed during the current study are available from the corresponding author on reasonable request. A PyMOL session file, named as “integrin-alphafold2-structure.pse”, that includes the predicted structures of integrin heterodimers were deposited online as [supplementary materials](#).

## 3. Results

### 3.1. The AlphaFold2 single-chain structures of 18 $\alpha$ and 8 $\beta$ human integrins

We extracted the structures of 18 human  $\alpha$  integrins from the AlphaFold2 protein structure database. These integrin structure models in the AlphaFold2 database were predicted based on the full-length single-chain amino acid sequence, encompassing the signal peptide, ectodomain, TM and CT domains (Fig. 1G). The predicted models showed high accuracy in the domain structures, as indicated by the high score of predicted local distance difference test (pLDDT) (Fig. 1G). To compare the overall conformation of  $\alpha$  integrin ectodomains, we superimposed all structures onto the calf-2 domain of  $\alpha_{IIb}$ , vertically oriented them relative to the cell membrane, and adjusted their rotations to display the position of the  $\beta$ -propeller domain relative to the membrane (Fig. 2). We also superimposed the AlphaFold2 structures with the experimental structures of  $\alpha_{IIb}$ ,  $\alpha_V$ ,  $\alpha_5$ , and  $\alpha_X$ . The structures were grouped based on ligand or cell specificity. Among the RGD-binding  $\alpha$  integrins,  $\alpha_{IIb}$  and  $\alpha_V$  displayed a sharp bent conformation, nearly identical to their crystal structures (Fig. 2A). However, the  $\alpha_5$  AlphaFold2 structure exhibited a more bent conformation than its half-bent cryo-EM structure (Fig. 2A). Among the three laminin receptors, only  $\alpha_6$  adopted a sharp bent conformation like the RGD receptors, while  $\alpha_3$  and  $\alpha_7$  showed a half-bent conformation (Fig. 2B). The  $\alpha_4$  and  $\alpha_9$  integrins also adopted a bent conformation similar to the RGD receptors (Fig. 2C). Interestingly, all four  $\alpha$  integrins of collagen receptors exhibited more extended conformation than bent, with  $\alpha_{10}$  in a nearly fully extended conformation (Fig. 2D). The five leukocyte-specific  $\alpha$  integrins displayed conformational diversity, with  $\alpha_L$  and  $\alpha_X$  being more bent than  $\alpha_M$ ,  $\alpha_D$ , and  $\alpha_E$  (Fig. 2E). The AlphaFold2 structure of  $\alpha_X$  closely resembled the  $\alpha_X$  crystal structure (Fig. 2E).





**Fig. 2.** AlphaFold2 structures of the ectodomains of 18 human  $\alpha$  integrins. The AlphaFold2 structures are represented in green, while the experimentally determined structures for  $\alpha_{11b}$  (PDB 3FCS),  $\alpha_V$  (PDB 4G1E),  $\alpha_5$  (PDB 7NXD), and  $\alpha_X$  (PDB 4NEH) are displayed in blue. Red sticks indicate putative N-linked glycosylation sites, and yellow sticks represent disulfide bonds. The structures were aligned based on the calf-2 domain and are oriented perpendicularly to the cell membrane.

We next analyzed the structures of 8 human  $\beta$  integrins, all of which were predicted as single-chain structures in the AlphaFold2 database. The predicted domain structures of  $\beta$  integrins also exhibit a high level of accuracy, as indicated by the pLDDT score (Fig. 1G). To compare the overall conformation, we superimposed the structures based on the  $\beta_3$   $\beta$ I domain, and then individually orientated them vertically to membrane normal. We also superimposed the AlphaFold2 structures with the experimental structures of  $\beta_1$ ,  $\beta_2$ , and  $\beta_3$ . As depicted in Fig. 3, the individual domains, including  $\beta$ I, PSI, hybrid, I-EGF domains, and  $\beta$ -tail domain ( $\beta$ -TD), were accurately predicted for  $\beta_1$  to  $\beta_7$  integrins. However, the  $\beta$ -TD of  $\beta_8$  appeared smaller than other  $\beta$  integrins, and its structure was incompletely predicted (Fig. 3,  $\beta_8$ ). The AlphaFold2 structures of  $\beta_3$ ,  $\beta_2$ ,  $\beta_4$ ,  $\beta_5$ ,  $\beta_6$ , and  $\beta_7$  all adopted a bent conformation as seen in the crystal structures of  $\beta_3$  and  $\beta_2$ , whereas the  $\beta_1$  and  $\beta_8$  structures exhibited less bending (Fig. 3). The half-bent conformation of  $\beta_1$  AlphaFold2 structure closely resembled the cryo-EM structure (Fig. 3,  $\beta_1$ ).

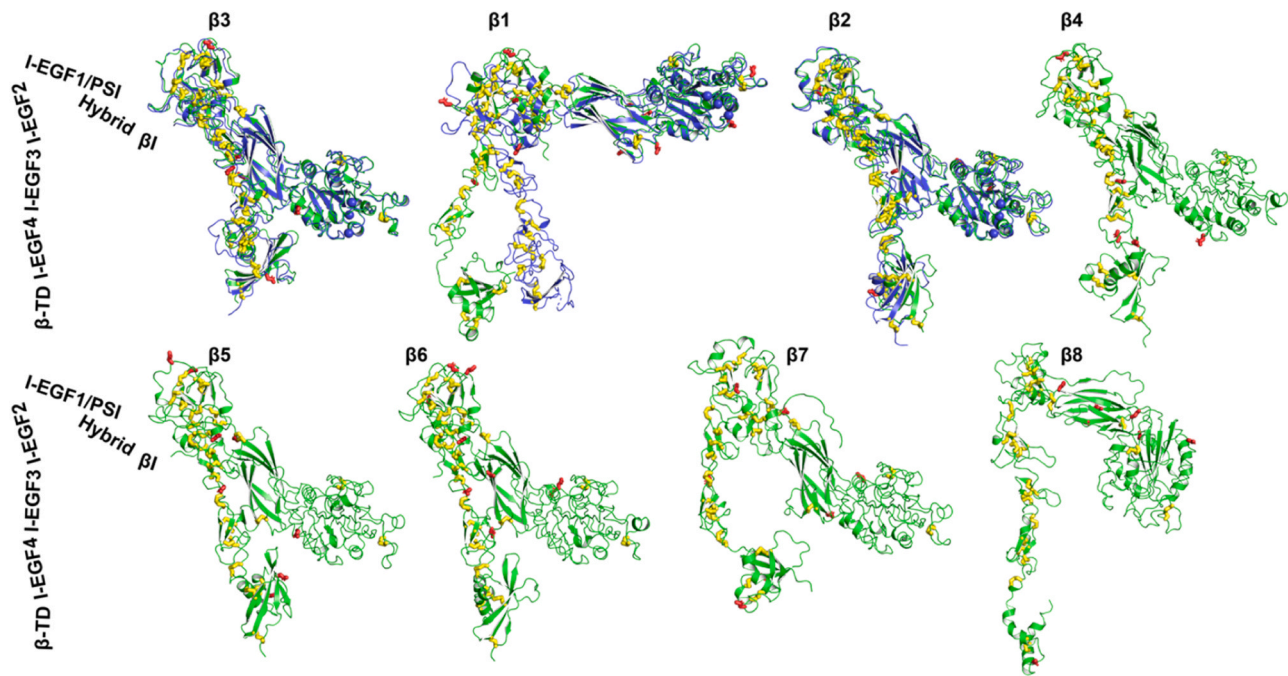
### 3.2. The domain interface where $\alpha$ and $\beta$ integrin subunits undergo extension

Previous structural studies have revealed that the extension of  $\alpha$  integrin occurs at the interface between the thigh and calf-1 domains, where a disulfide bonded knob, known as the genu, is located (Fig. 1C, F). We conducted a sequence alignment of all  $\alpha$  integrins at the junction between the thigh and calf-1 domains (Fig. 4A). To illustrate the

interface between the thigh and calf-1 domains in a bent conformation, we used the structure of  $\alpha_{11b}$  as an example (Fig. 4B). Interfacial residues are highlighted in red in the sequence alignment (Fig. 4A) and shown as red sticks in the structure (Fig. 4B). The sequence alignment reveals that the interfacial residues, as well as the putative N-glycan sites, are not highly conserved (Fig. 4A). Some  $\alpha$  integrins, such as  $\alpha_V$ ,  $\alpha_8$ ,  $\alpha_4$ ,  $\alpha_9$ ,  $\alpha_{10}$ , and  $\alpha_E$ , contain putative N-glycan sites at the interface of either thigh or calf-1 domains. Interestingly, the laminin receptors  $\alpha_3$ ,  $\alpha_6$ , and  $\alpha_7$  all have a longer interfacial loop (region 1) on the calf-1 domain (Fig. 4A). However, no signature sequences appear to indicate a preference for a bent or extended conformation.

The integrin  $\beta$  subunit extends at the junction between I-EGF-1 and I-EGF-2 (Fig. 1C, F). Sequence alignment of the eight human  $\beta$  integrins in this region showed no obvious residue conservation, except for the typical disulfide bonds of EGF domains (Fig. 4C). In the bent conformation of  $\beta_3$  integrin (Fig. 4D), the interface between I-EGF-1 and I-EGF-2 is considerably smaller compared to the interface between the thigh and calf-1 in  $\alpha_{11b}$  (Fig. 4B), suggesting that it is unlikely to play a major role in maintaining the bent structure. However, the length of C1-C2 loop in I-EGF-2 domain has been shown to regulate integrin extension [48]. Notably, a landmark disulfide bond is absent in the I-EGF-1 domain of  $\beta_8$  (Fig. 4C), which may contribute, at least in part, to the distinct conformational regulation of  $\beta_8$  integrin.





**Fig. 3.** AlphaFold2 structures of 8 human  $\beta$  integrins. AlphaFold2 structures are depicted in green, while experimentally determined structures for  $\beta_3$  (PDB 3FCS),  $\beta_1$  (PDB 7NXD), and  $\beta_2$  (PDB 4NEH) are shown in blue. The putative N-linked glycosylation sites are represented as red sticks, and disulfide bonds are shown as yellow sticks. The structures were aligned based on the  $\beta_3$   $\beta$ I domain and are oriented perpendicularly to the cell membrane.

### 3.3. $\alpha_{10}$ integrin prefers an extended conformation on cell surface

Among the 18  $\alpha$  integrins, the AlphaFold2 structure of  $\alpha_{10}$  reveals an extended conformation (Fig. 2D). This extended structure was also observed in  $\alpha_{10}$  from other species, such as mouse, rat, and zebrafish (Fig. 5A). Notably, we identified a conserved putative N-glycan site (N839 in human) at the interface between the thigh and calf-1 domains of  $\alpha_{10}$  integrin (Fig. 5A). It is plausible that N-glycans at this site may interfere with the bent conformation (Fig. 5B).

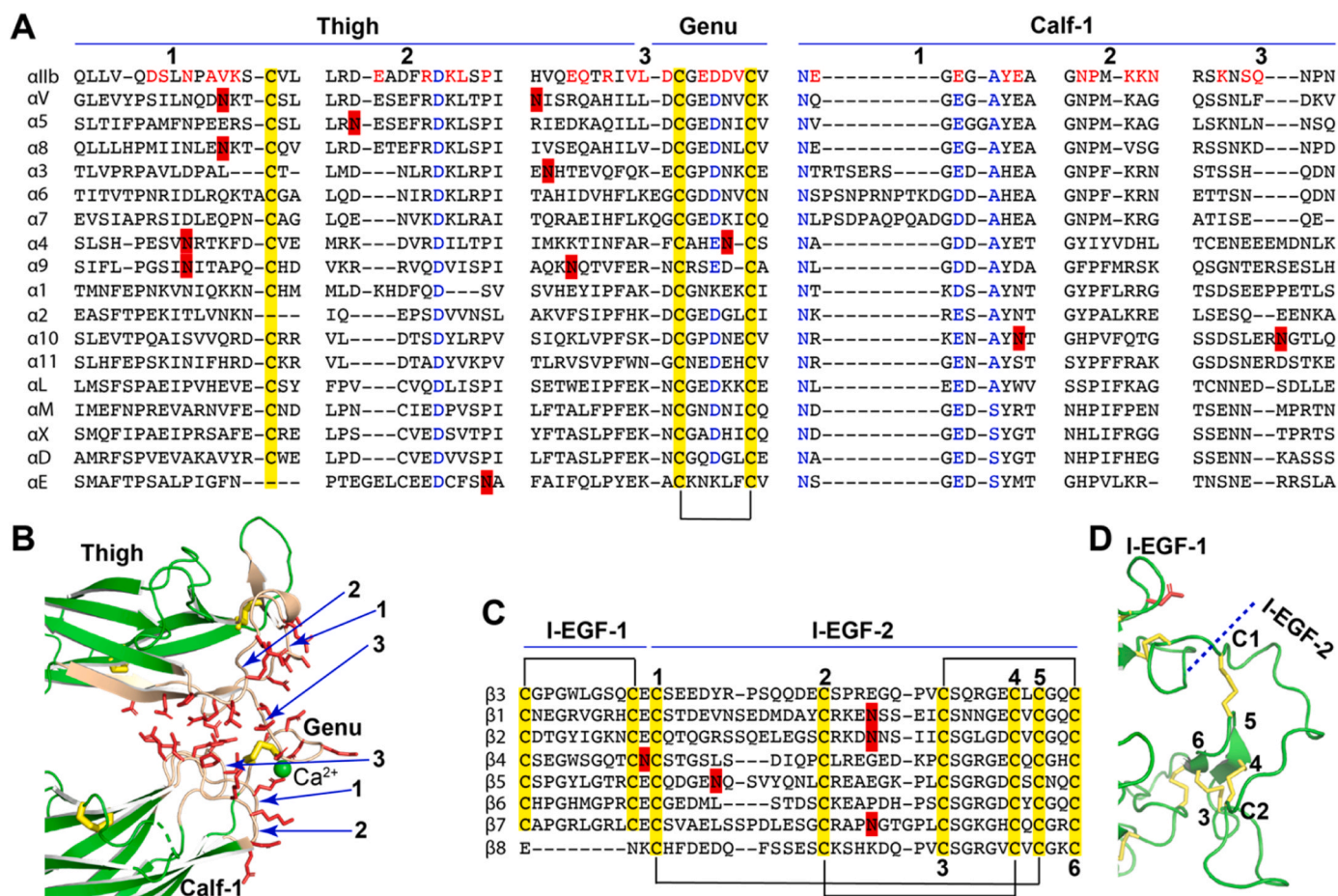
It is important to note that  $\alpha_{10}$  integrin only forms heterodimer with  $\beta_1$  integrin. The AlphaFold2 structures of human, mouse, cat, and chicken  $\beta_1$  integrins all exhibit a half-bent conformation (Fig. 5C). To measure the conformation of  $\alpha_{10}\beta_1$  on cell surface, we used mAb 9EG7, which recognizes the  $\beta_1$  I-EGF-2 epitope that remains concealed in the bent conformation (Fig. 5C) [49]. This antibody reports on  $\beta_1$  integrin extension. As a positive control, we used the universal integrin activator  $Mn^{2+}$  to induce integrin extension. For comparison with  $\alpha_{10}$ , we selected  $\alpha_3$ ,  $\alpha_5$ ,  $\alpha_7$ , and  $\alpha_9$  integrins.

In our experiments,  $\alpha$  integrins were expressed as EGFP-fusion proteins alongside  $\beta_1$  integrin in HEK293T cells. Flow cytometry analysis under physiological metal ion condition (1 mM  $Ca^{2+}/Mg^{2+}$ ) revealed that  $\alpha_{10}$ -EGFP/ $\beta_1$  cells exhibited higher binding to 9EG7 compared to other integrins (Fig. 5D). Conversely,  $\alpha_7$ -EGFP/ $\beta_1$  and  $\alpha_9$ -EGFP/ $\beta_1$  cells showed increased 9EG7 binding only under the activating condition (0.1 mM  $Ca^{2+}/2$  mM  $Mn^{2+}$ ). In contrast,  $\alpha_3$ -EGFP/ $\beta_1$  cells did not respond to  $Mn^{2+}$  (Fig. 5D).  $\alpha_5$ -EGFP/ $\beta_1$  cells also exhibited limited responsiveness to  $Mn^{2+}$  for 9EG7 binding compared to  $\alpha_7$  and  $\alpha_9$ . However, the RGD-like compound MK-0429 effectively induced 9EG7 binding to  $\alpha_5$ -EGFP/ $\beta_1$  cells (Fig. 5D). Notably,  $Mn^{2+}$  did not further increase 9EG7 binding to  $\alpha_{10}$ -EGFP/ $\beta_1$  cells (Fig. 5D). Mutating the putative N-glycan site at the interface between the thigh and calf-1 domains of  $\alpha_{10}$  integrin ( $\alpha_{10}$ -N839Q) did not affect 9EG7 binding (Fig. 5D). These data suggest that  $\alpha_{10}$  integrin maintains a constitutively extended conformation on cell surface.

### 3.4. The integrin $\alpha/\beta$ heterodimer structures predicted by AlphaFold2-multimer

Integrins are typically expressed as heterodimers on cell surface, consisting of both  $\alpha$  and  $\beta$  subunits. However, the integrin structures in AlphaFold2 database were modeled individually for the single-chain  $\alpha$  and  $\beta$  subunits, as described above. To construct integrin structures containing both  $\alpha$  and  $\beta$  subunits, we utilized the AlphaFold2-multimer module for structure prediction of all 24 human integrin heterodimers. To prevent potential model bias arising from the templates of experimental integrin structures, we set the template search date to the year 2000, predating the reporting of any integrin heterodimer structures. Impressively, AlphaFold2-multimer successfully predicted the structures of all 24 integrin heterodimers (Fig. 6). These structures were categorized based on their ligand or cell specificity. To facilitate conformational comparisons, all structures were superimposed onto the  $\alpha_{IIb}$  calf-2 domain and individually orientated to align their ectodomains vertically with respect to the cell membrane (Fig. 6). Overall, the inter-subunit interfaces, including those of the  $\alpha$   $\beta$ -propeller and  $\beta$   $\beta$ I domains, were accurately modeled. Notably, the AlphaFold2 structures of  $\alpha_{IIb}\beta_3$  and  $\alpha_V\beta_3$  ectodomains closely resembled their respective crystal structures, with a C $\alpha$  root-mean-square deviation (RMSD) of approximately 2 Å, highlighting the outstanding capability of AlphaFold2 in modeling integrin structures. Among the RGD receptors, all adopted a bent conformation, except  $\alpha_5\beta_1$ , which exhibited a half-bent structure (Fig. 6A). Similarly, all laminin receptors, including  $\alpha_7\beta_1$ , displayed a bent conformation (Fig. 6B). Interestingly, the four collagen receptors, including  $\alpha_{10}\beta_1$ , exhibited a half-bent structure (Fig. 6C), in contrast to the AlphaFold2 structure of single-chain  $\alpha_{10}$  showing a more extended conformation (Fig. 2D). Within the leukocyte-specific integrins, only  $\alpha_L\beta_2$  and  $\alpha_E\beta_7$  displayed a sharp bent conformation, while  $\alpha_M\beta_2$ ,  $\alpha_X\beta_2$ ,  $\alpha_D\beta_2$ , and  $\alpha_E\beta_7$  appeared to be more extended (Fig. 6D). The AlphaFold2 structures of  $\alpha_4\beta_1$  and  $\alpha_9\beta_1$  showed a half-bent conformation (Fig. 6E). It is worth noting that the relative orientation of the TM domains to the cell membrane was not correctly predicted for most of the structures.

As nine of the integrin structures predicted by AlphaFold2-multimer show artificial interactions between TM-CT and ectodomains (Fig. 7A),



**Fig. 4.** Sequence and structure of the domain interface where integrin becomes extended. (A) Sequence alignment of the human  $\alpha$  integrin thigh and calf-1 domain junction interface. Interfacial residues of  $\alpha_{11b}$  are highlighted in red, while highly conserved residues are in blue. Disulfide bonds are indicated in yellow, and putative N-glycan sites are marked in red. (B) The interface between the thigh and calf-1 domains of the bent  $\alpha_{11b}$  structure. The loops at the interface are numbered in panels A and B. Interfacial residues are shown as red sticks. Disulfide bonds are represented by yellow sticks. (C) Sequence alignment of the human  $\beta$  integrin I-EGF-1 and I-EGF-2 domain junction. Disulfide bonds are highlighted in yellow and putative N-glycan sites are marked in red. The six cysteines of I-EGF-2 domain are numbered. (D) Structure of  $\beta_3$  I-EGF-1 and I-EGF-2 domain junction. Disulfide bonds are shown as yellow sticks, and one N-glycan site on I-EGF-1 is depicted as a red stick.

we asked whether such interactions have any impact on the overall integrin structure prediction. We performed AlphaFold2-multimer modeling of the nine integrin structures in the absence of the TM-CT sequences. Surprisingly, the resulting structures closely matched those containing TM-CT domains (Fig. 7B), indicating that the structure modeling of the ectodomain and TM-CT domains does not influence each other during the structure calculation by AlphaFold2-multimer.

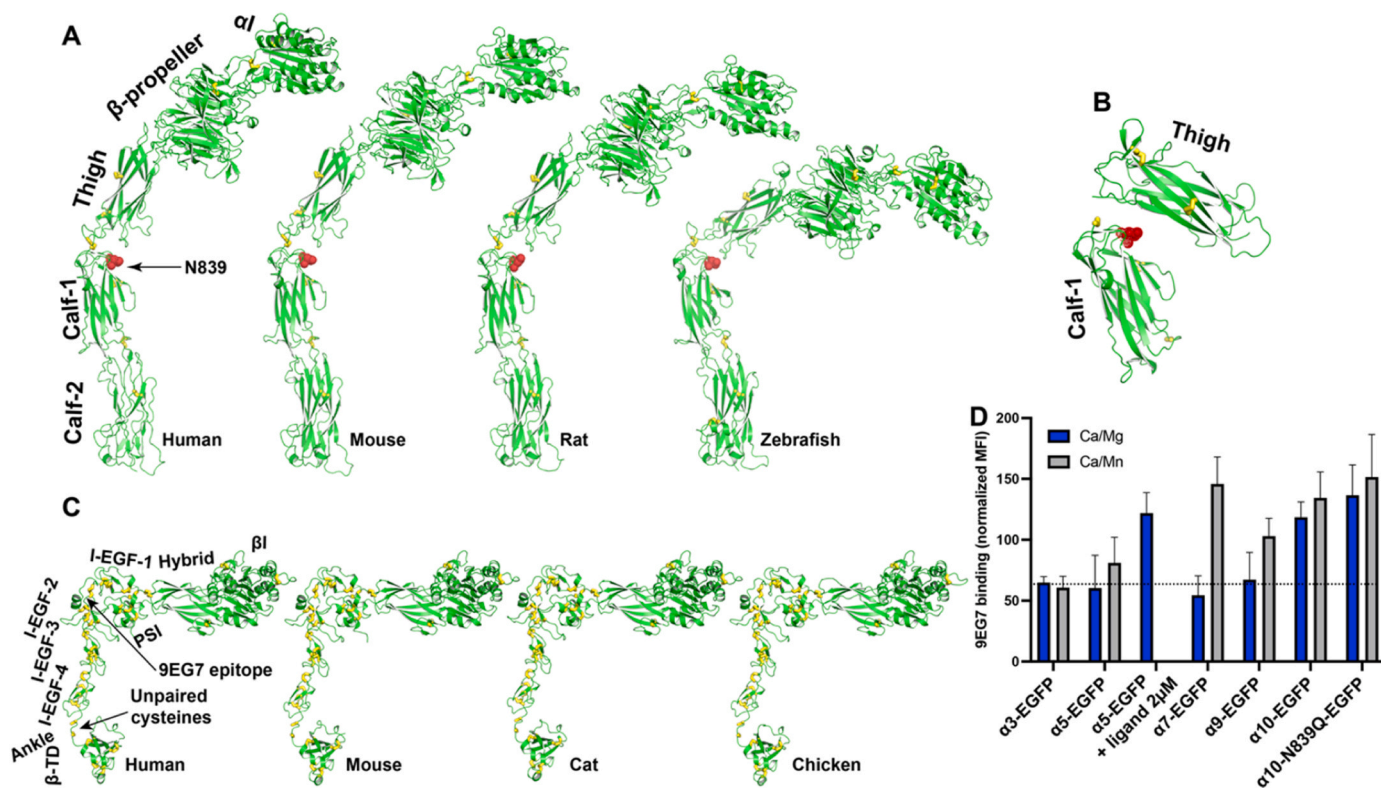
We proceeded to investigate whether the provision of structure templates to AlphaFold2-multimer had any impact on the calculation of integrin structures. For this test, we selected  $\alpha_5\beta_1$ ,  $\alpha_{10}\beta_1$ ,  $\alpha_V\beta_8$ , and  $\alpha_X\beta_2$  integrins. The template searching date was set to the year 2023, which allowed AlphaFold2 to use the integrin crystal structures as templates during structure calculation. The results show that all four integrin structures calculated by AlphaFold2-multimer, denoted as  $\alpha_5\beta_1$ -2023,  $\alpha_{10}\beta_1$ -2023,  $\alpha_V\beta_8$ -2023, and  $\alpha_X\beta_2$ -2023, exhibited a sharp bent conformation (Fig. 8A–D), closely resembling the crystal structure of bent  $\alpha_{11b}\beta_3$  (Fig. 8A). For  $\alpha_5\beta_1$  integrin, this contrasts with the half-bent structure predicted by AlphaFold2-multimer with a search date set at the year 2000, denoted as  $\alpha_5\beta_1$ -2000 (Fig. 8A). Indeed, the  $\alpha_5\beta_1$ -2000 structure closely resembles the  $\alpha_5\beta_1$  cryo-EM structure (Fig. 8A). Similarly, the  $\alpha_{10}\beta_1$ -2023 structure showed a bent conformation compared to the half bent  $\alpha_{10}\beta_1$ -2000 structure (Fig. 8B). However, both  $\alpha_V\beta_8$ -2023 and  $\alpha_V\beta_8$ -2000 structures exhibited similar bent conformation (Fig. 8C). In contrast, the  $\alpha_X\beta_2$ -2023 structure closely resembled the bent  $\alpha_X\beta_2$  crystal

structure, while the  $\alpha_X\beta_2$ -2000 structure appeared extended (Fig. 8D). These findings suggest that the inclusion of template structures can significantly influence the outcomes of structure prediction by AlphaFold2-multimer.

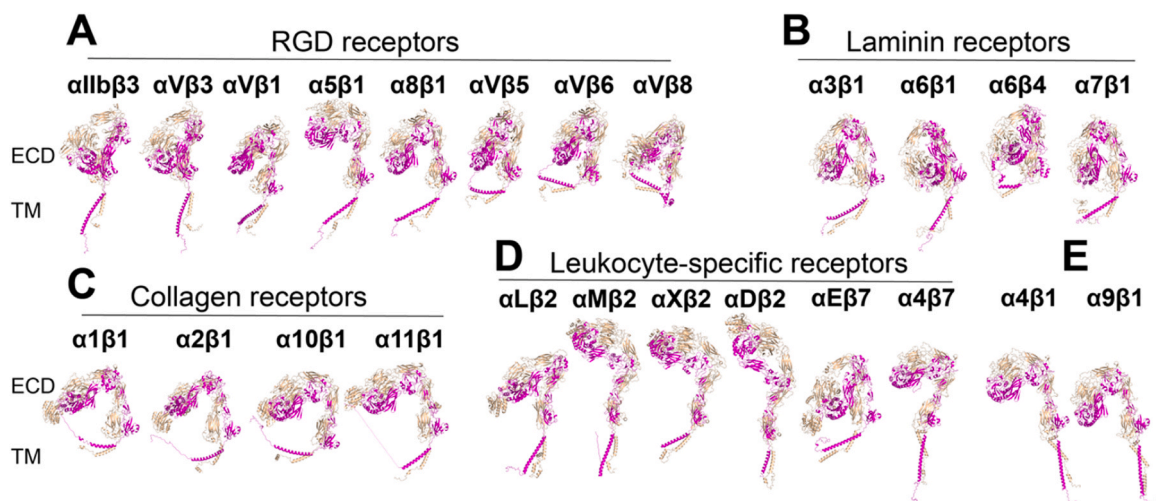
### 3.5. Structures of integrin TM-CT domains

Despite the apparent simplicity of the sequences and structures of integrin TM and CT domains, experimental structure determination has been limited to the  $\alpha_{11b}\beta_3$  TM-CT heterodimer. Through sequence alignment of the TM-CT domains from 8  $\beta$  and 18  $\alpha$  human integrins, we identified conservative features at the TM, membrane-proximal (MP), and membrane-distal (MD) regions (Fig. 9A). These sequence conservative features were analyzed in the 24 integrin TM-CT structures calculated by AlphaFold2-multimer (Fig. 9B). Structure alignment revealed a high degree of structural similarity among the heterodimers at the TM domain, highlighting the conserved GXXXG motif in  $\alpha$  and the conserved small G/A residue in  $\beta$  at the  $\alpha/\beta$  TM interface (Fig. 9B). In the CT MP regions, the conserved GFFKR motif in the 18  $\alpha$  integrins all adopted a reverse turn conformation. The  $\beta$  CT MP regions, except for  $\beta_4$  and  $\beta_8$  integrins, displayed an  $\alpha$ -helical structure extending from the TM  $\alpha$ -helix, with the conserved Asp residue located at the  $\alpha/\beta$  interface (Fig. 9B). The conserved  $\beta$  CT Asp residue is positioned proximal to the conserved Arg residue in the  $\alpha$  GFFKR motif (Fig. 9B), which was





**Fig. 5. AlphaFold2 structures of  $\alpha_{10}$  and  $\beta_1$  integrins from different species.** (A) Structures of  $\alpha_{10}$  integrins from human, mouse, rat, and zebrafish. The structures were aligned based on the calf-2 domain and oriented perpendicularly to the cell membrane. The N-glycan site at the thigh/calf-1 interface is shown as a red stick. (B) Relative positions of  $\alpha_{10}$  thigh and calf-1 domains in the fully bent conformation, illustrating the interfacial location of the N-glycan site shown as red sticks. The thigh and calf-1 domains of  $\alpha_{10}$  were superimposed on those of bent  $\alpha_{IIb}$  integrin structure. (C) Structures of  $\beta_1$  integrins from human, mouse, cat, and chicken. The structures were aligned based on the  $\beta_I$  domain and oriented perpendicularly to the cell membrane. (D) Conformation of  $\beta_1$  integrin co-expressed with selected integrin  $\alpha$  subunits with a C-terminal EGFP tag were co-expressed with human  $\beta_1$  in 293T cells. The binding of mAb 9EG7 or MAR4 was measured by flow cytometry in a buffer containing 1 mM  $Ca^{2+}/Mg^{2+}$  or 0.1 mM  $Ca^{2+}$  plus 2 mM  $Mn^{2+}$ . The data are presented as the MFI of 9EG7 binding as a percentage of the MFI of MAR4 binding.

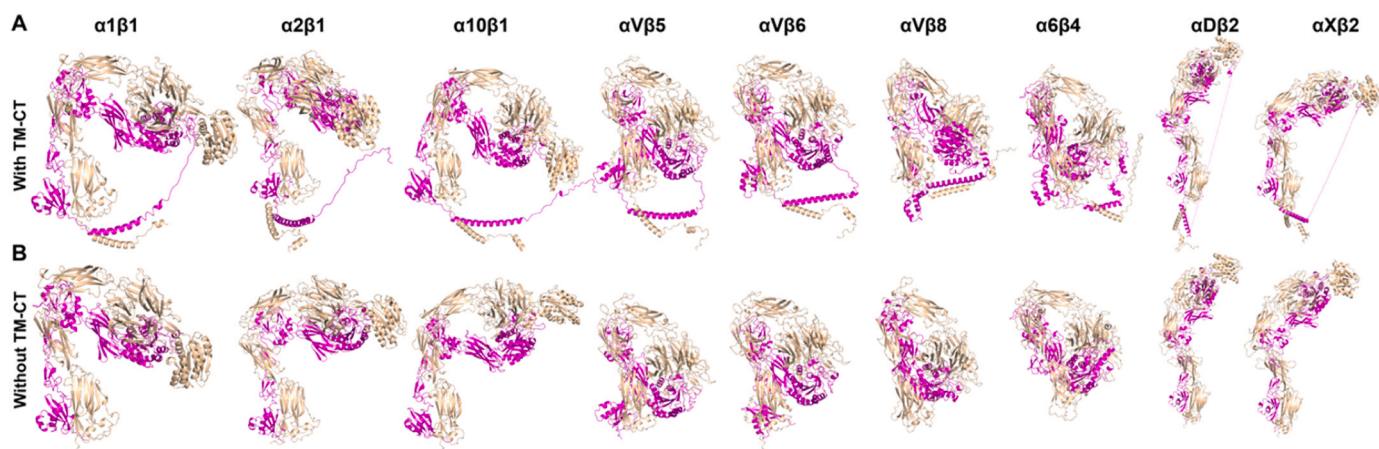


**Fig. 6. Structures of 24 human integrins predicted by AlphaFold2-multimer.** (A-E) Full-length integrin structures were calculated using AlphaFold2-multimer with the max\_template\_date set to year 2000. Structures were superimposed onto the calf-2 domain of the  $\alpha_{IIb}$  subunit and are presented in the same orientation. The  $\alpha$  and  $\beta$  subunits are shown in wheat and magenta, respectively.

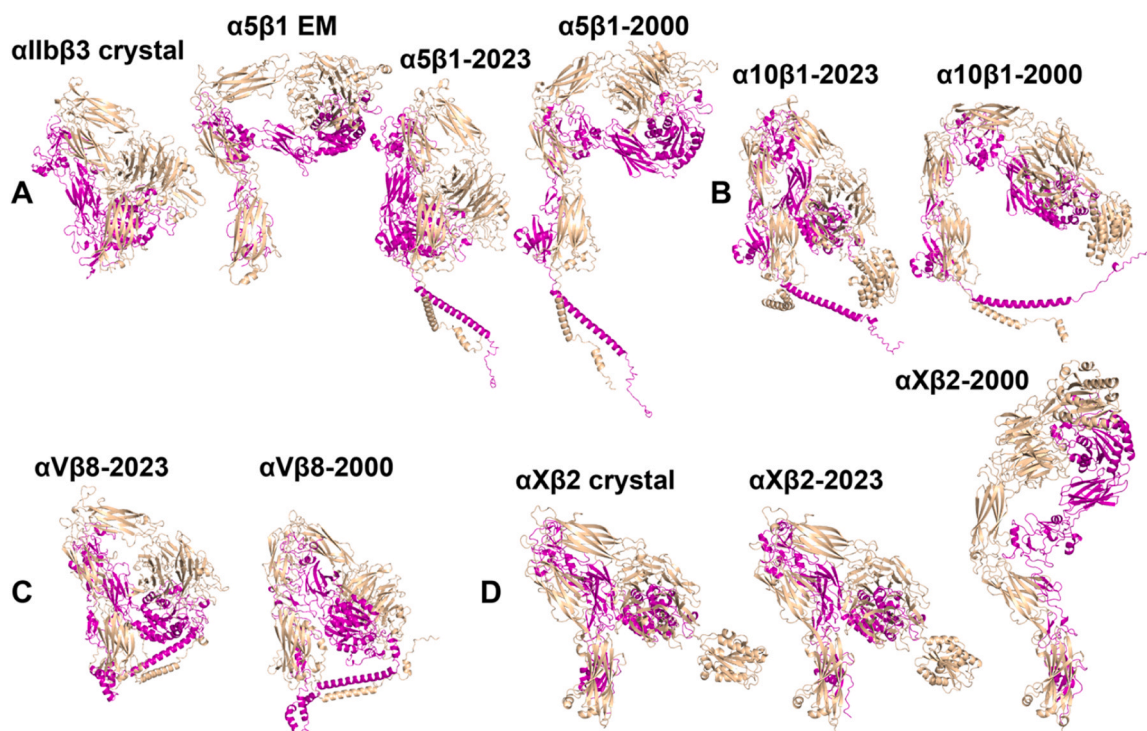
proposed to form a salt bridge interaction [50]. The CT MD regions of both  $\alpha$  and  $\beta$  subunits exhibited diverse disordered conformations, including the conserved NPXY motif responsible for binding talin (Fig. 9B). Despite not including any integrin TM-CT structure templates during the AlphaFold2-multimer calculation, the predicted  $\alpha_{IIb}\beta_3$  TM-CT

structure closely resembled the experimentally determined structure (Fig. 9C). Additionally, we performed AlphaFold2-multimer modeling for the  $\alpha_{IIb}\beta_3$  TM-CT structure in the absence of the ectodomain, which showed a similar TM interface as the model generated along with the ectodomain (Fig. 9D). These results suggest that AlphaFold2-multimer is





**Fig. 7.** Comparison of structures predicted by AlphaFold2-multimer with and without transmembrane and cytoplasmic domains. (A) Full-length structures of certain integrins calculated by AlphaFold2-multimer exhibit artificial contacts between the ectodomain and TM-CT domains. (B) The integrins shown in panel A were re-modeled by AlphaFold2-multimer in the absence of TM-CT domains. The structures were superimposed based on the calf-2 domain of the  $\alpha$  subunit and are presented in the same orientation. The  $\alpha$  and  $\beta$  subunits are shown in wheat and magenta, respectively.



**Fig. 8.** Comparison of selected structures predicted by AlphaFold2-multimer with and without enabling the option to use known structures as templates. (A) Full-length  $\alpha 5\beta 1$  structures were calculated by AlphaFold2-multimer with the `max_template_date` set to either year 2023 or 2000. Crystal structure of  $\alpha 11\beta 3$  (PDB 3FCS) and the cryo-EM structure of  $\alpha 5\beta 1$  (PDB 7NXD) were provided for comparison. (B) AlphaFold2 structures of full-length  $\alpha 10\beta 1$  with the `max_template_date` set to either year 2023 or 2000. (C) Full-length  $\alpha V\beta 8$  structures modeled by AlphaFold2-multimer with the `max_template_date` set to either year 2023 or 2000. (D) AlphaFold2 structures of ectodomain of  $\alpha X\beta 2$ . The crystal structure of  $\alpha X\beta 2$  (PDB 4NEH) was shown for comparison.

capable of accurately predicting integrin TM structures.

#### 4. Discussion

Our AlphaFold2-assisted structural analysis of the entire integrin family demonstrated the high performance of AlphaFold2 in predicting integrin structures. Sequence alignment analysis revealed an average sequence identity of 30–40% among the 8  $\beta$  integrins and 20–40% among the 18  $\alpha$  integrins [38]. For individual integrin domains, such as the  $\beta I$  domain, the sequence identity can exceed 60% [10–12]. Since AlphaFold2 incorporates amino acid sequences, multiple sequence

alignments, and homologous structures in its structure calculation [44], the high sequence identity among integrin domains likely contribute to the accurate prediction of integrin domain structures for most family members. This accuracy is exemplified by the striking similarity between the predicted structures and the experimental structures of  $\alpha 11\beta 3$ ,  $\alpha V\beta 3$ , and  $\alpha X\beta 2$ . Therefore, these predicted domain structures of integrins can be employed with a high level of confidence. They serve as valuable structural references for delineating domain boundaries when constructing integrin proteins for structural and functional studies. Moreover, the high-resolution structural models can be used for mutagenesis studies, identifying putative N-glycan sites and antibody epitopes, and





remains consistent regardless of the presence or absence of TM-CT domains. Similarly, AlphaFold2-multimer effectively modeled the heterodimeric structures of integrin TM-CT domains, even in the absence of the ectodomain. Additionally, AlphaFold2 modeling may capture the conformational heterogeneity and intrinsically disordered regions, as observed in the predicted structures of integrin cytoplasmic domains.

Despite its relatively high accuracy, the integrin structures predicted by AlphaFold2 have apparent limitations. Notably, these predictions do not incorporate glycan structures and essential metal ions, both of which are vital components for integrin structure and function. Furthermore, the relative orientation between ectodomain and TM-CT domains cannot be correctly modeled by AlphaFold2. Additionally, our observations indicate that AlphaFold2-multimer predictions can be influenced by the homologous structures, potentially introducing bias when modeling the overall conformation of integrins. Therefore, we recommend conducting integrin structure calculations with AlphaFold2-multimer in the absence of template structures.

## 5. Conclusions

In summary, our family-wide structural analysis of integrins using AlphaFold2 showcases the remarkable capabilities of AlphaFold2 in modeling complex structures. The comprehensive structure database containing all 24 integrin heterodimers can be used as high-resolution structure resources for advancing both structural and functional studies within the integrin family.

## Funding

This work was supported by the grant R01 HL131836 (to J. Zhu) from the Heart, Lung, and Blood Institute of the National Institute of Health.

## CRedit authorship contribution statement

**Heng Zhang:** Investigation, Visualization, Writing – review & editing. **Daniel S. Zhu:** Visualization, Writing – review & editing. **Jieqing Zhu:** Conceptualization, Supervision, Visualization, Funding acquisition, Writing – original draft.

## Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

## Acknowledgement

We thank the Research Computing Center at the Medical College of Wisconsin for providing the help and resources in running the AlphaFold2 program.

## Appendix A. Supporting information

Supplementary data associated with this article can be found in the online version at [doi:10.1016/j.csbj.2023.09.022](https://doi.org/10.1016/j.csbj.2023.09.022).

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