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#### **Permalink**

https://escholarship.org/uc/item/47c35183

#### Journal

Biochemistry, 58(30)

#### **ISSN**

0006-2960

#### **Authors**

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#### **Publication Date**

2019-07-30

#### DOI

10.1021/acs.biochem.9b00430

Peer reviewed

Published in final edited form as:

Biochemistry. 2019 July 30; 58(30): 3251–3259. doi:10.1021/acs.biochem.9b00430.

# Modulating Integrin $allb\beta$ 3 Activity through Mutagenesis of Allosterically Regulated Intersubunit Contacts

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#### **Abstract**

Integrin  $aIIb\beta3$ , a transmembrane heterodimer, mediates platelet aggregation when it switches from an inactive to an active ligand-binding conformation following platelet stimulation. Central to regulating  $aIIb\beta3$  activity is the interaction between the aIIb and  $\beta3$  extracellular stalks, which form a tight heterodimer in the inactive state and dissociate in the active state. Here, we demonstrate that alanine replacements of sensitive positions in the heterodimer stalk interface destabilize the inactive conformation sufficiently to cause constitutive  $aIIb\beta3$  activation. To determine the structural basis for this effect, we performed a structural bioinformatics analysis and found that perturbing intersubunit contacts with favorable interaction geometry through substitutions to alanine quantitatively accounted for the degree of constitutive  $aIIb\beta3$  activation. This mutational study directly assesses the relationship between favorable interaction geometry at mutation-sensitive positions and the functional activity of those mutants, giving rise to a simple model that highlights the importance of interaction geometry in contributing to the stability between protein–protein interactions.

#### **Graphical abstract**

ASSOCIATED CONTENT

**Supporting Information** 

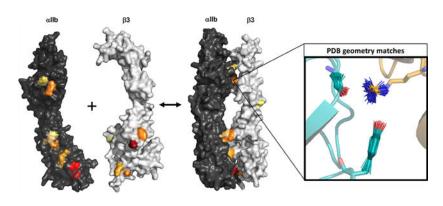
The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.biochem.9b00430. Tables S1 and S2 and Figure S1 (PDF)

Accession Codes

PDB entry 3FCS: chains A (residues 599–959) and B (residues 483–690) of the  $\alpha IIb\beta 3$  crystal structure.

The authors declare no competing financial interest.

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Integrin aIIb $\beta$ 3 resides on the platelet surface in a regulated and finely tuned equilibrium between resting low-affinity and active high-affinity conformations that can be perturbed by bidirectional signal transduction. Crystal structures of resting aIIb $\beta$ 3 have revealed that its extracellular domain has a bent conformation with its nodular ligand-binding headpiece oriented toward the cell surface<sup>2,3</sup> and with contacts between the  $\beta$ 3 and aIIb stalks forming a clasp that maintains its inactive state (Figure 1). Following platelet stimulation, aIIb $\beta$ 3 undergoes a global rearrangement5 in which its ligand-binding headpiece turns away from the cell surface and its transmembrane (TM) and stalk domains separate. This causes the integrin to shift to a fully extended conformation, exposing its ligand-binding site. In vivo, intracellular signals shift aIIb $\beta$ 3 toward its high-affinity ligand-binding conformation ("inside-out signaling"). However, aIIb $\beta$ 3 can also be experimentally shifted to its active conformation by replacing individual amino acids in its TM or membrane-proximal extracellular stalk domains, although the magnitude of the shift varies from replacement to replacement.

In this study, we characterized the  $\alpha$ IIb $\beta$ 3 stalk interface by introducing alanine replacements and measuring their effects on constitutive integrin activation. Protein–protein interfaces, such as the interface between the  $\alpha$ IIb and  $\beta$ 3 stalks, are usually large complementary surfaces with many intermolecular contacts. Nonetheless, as Clackson and Wells pointed out, a limited number of complementary side chain interactions in protein –protein interfaces, termed "hot spots", are disproportionately responsible for the strength of binding. Previously, we used the Rosetta alanine scanning algorithm to identify hot spots in the  $\beta$ 3 stalk and found that replacing them with alanine was sufficient to activate both  $\alpha$ IIb $\beta$ 3 and  $\alpha$ v $\beta$ 3. However, while the alanine scanning algorithm successfully predicted mutations that destabilized the stalk interface, it did not correctly rank their functional effects, likely because the energetic effects of the alanine substitutions were weak and within the margin of error reported for this method. 11

Here, we sought to identify hot spots in the  $\alpha$ IIb stalk that are complementary to those we previously identified in  $\beta$ 3. Initially, we scanned the  $\alpha$ IIb Calf-1 and Calf-2 domains using the Rosetta-based alanine scanning algorithm and subsequently using the recently described Rosetta flex ddG protocol. The latter enables more accurate G predictions by generating ensembles of models sampling different backbone conformations, whereas the former does not. However, neither method was able to accurately predict the relative

contribution of the identified hot spots to the stability of the  $\alpha \text{IIb}\beta 3$  stalk complex. Therefore, to more precisely map the  $\alpha \text{IIb}\beta 3$  stalk interface, we developed a structural bioinformatics method based on the premise that the detailed geometries of the most stabilizing intersubunit side chain–side chain interactions would be overrepresented in the Protein Data Bank (PDB). We used the results of this analysis to compute an interaction geometry score that was better able to rationalize the nature of destabilizing mutations in the stalk interface than the flex ddG protocol. In addition, we found that specific stalk domain hot spots are responsible for maintaining the inactive state of  $\alpha \text{IIb}\beta 3$ . Because the stalks are present in an extracellular location, these results suggest that stabilizing the stalk heterodimers may be a way to allosterically attenuate  $\alpha \text{IIb}\beta 3$  function.

#### **METHODS**

#### Computational Alanine Scanning Using Rosetta-Based Scanning Algorithms.

For all of our computational analyses, we used chains A (residues 599–959) and B (residues 483–690) from the  $\alpha$ IIb $\beta$ 3 crystal structure (PDB entry 3FCS).<sup>4</sup> We initially used Rosetta interface alanine scanning, hosted on the Robetta server, to predict hot spots in the  $\alpha$ IIb stalk. 11,13 After completing the experimental aspects of this work, we repeated the computational alanine scanning mutagenesis using flex ddG, a recently developed method built within the Rosetta macromolecular modeling suite that provides more accurate predictions by generating ensembles of models that sample over different backbone and side chain conformations. 12 G predictions were calculated using the hyperparameters recommended in the flex ddG tutorial Github repository (https://github.com/Kortemme-Lab/ flex ddG tutorial). Briefly, ensembles of wild-type (WT) and alanine mutant models were generated by sampling 35000 backrub backbone perturbation ("backrub") and minimization G's between WT and alanine mutants were calculated using Rosetta energy function terms that were reweighted to better fit experimental G's reported in the ZEMu protein–protein interaction benchmark set. 12,14

#### Stable Expression of allb 3 in Chinese Hamster Ovary (CHO) Cells.

Full-length cDNAs for human  $\alpha$ IIb and  $\beta$ 3 were inserted into pcDNA3.1(+) Neo and pcDNA3.1(+) Zeo (Invitrogen), respectively. Single-amino acid substitutions were introduced into the  $\alpha$ IIb cDNA by polymerase chain reaction (PCR) using the QuickChange Site-Directed Mutagenesis Kit (Stratagene). The forward and reverse primers for the PCR are listed in Table S1. All mutated sequences were confirmed by DNA sequence analysis.

CHO cells were cultured in Ham's F-12 medium (Gibco/ BRL) supplemented with 10% fetal bovine serum (Hyclone Laboratories). Plasmids containing cDNAs for WT and mutant  $\alpha$ IIb and  $\beta$ 3 were introduced into the CHO cells using FuGENE 6 according to the manufacturer's instructions (Roche Molecular Biochemicals). Two days after being transfected, the cells were transferred to selection medium containing 500  $\mu$ g/mL G418 (Gibco/BRL) and 300  $\mu$ g/mL Zeocin (Invitrogen). After selection for 3 weeks,  $\alpha$ IIb $\beta$ 3 expression was assessed by flow cytometry using A2A9, a monoclonal antibody (mAb) that recognizes the human  $\alpha$ IIb $\beta$ 3 heterodimer. <sup>15</sup> Transfected cells were then repeatedly sorted

by fluorescence-activated cell sorting to obtain subclones expressing comparable high levels of WT and mutant  $\alpha IIb\beta 3$ .

#### Fibrinogen Binding to CHO Cells Expressing $allb\beta 3$ .

Fibrinogen binding to CHO cell subclones expressing comparable amounts of WT and mutant  $\alpha \text{IIb}\beta 3$  was measured as described previously. He are fibrinogen binding to CHO cells (2 × 10<sup>6</sup> cells/mL) were incubated with the  $\beta 3$  mAb SSA6 conjugated to Alexa Fluor 647 (Invitrogen) to label  $\alpha \text{IIb}\beta 3$  and freshly prepared 5 mM dithiothreitol (DTT) with or without 2 mM EDTA for 15 min at 37 °C. The labeled cells were then incubated for 15 min at 37 °C with 200  $\mu \text{g/mL}$  fibrinogen conjugated with Alexa Fluor 488 (Molecular Probes). Cells were washed, fixed with 4% paraformaldehyde in phosphate-buffered saline (PBS), and examined by two-color fluorescence-activated cell sorting analysis. Fibrinogen specifically bound to  $\alpha \text{IIb}\beta 3$  was defined as fibrinogen binding that was inhibited by EDTA. Statistical analyses of the fibrinogen binding data were performed using Microsoft Excel for Mac.

Specific fibrinogen binding data were used to calculate an  $\alpha$ IIb $\beta$ 3 activation index (AI), defined by eq 1:

$$AI = (FB_c - FB_{c+EDTA})/(FB_{DTT} - FB_{DTT+EDTA})$$
(1)

where FB<sub>c</sub> represents fibrinogen binding to  $\alpha$ IIb $\beta$ 3 in the absence of an activating agent; FB<sub>DTT</sub>, fibrinogen binding to  $\alpha$ IIb $\beta$ 3 induced by 5 mM DTT; FB<sub>c+EDTA</sub>, constitutive fibrinogen binding to  $\alpha$ IIb $\beta$ 3 in the presence of 2 mM EDTA; and FB<sub>DTT+EDTA</sub>, fibrinogen binding to  $\alpha$ IIb $\beta$ 3 induced by 5 mM DTT in the presence of 2 mM EDTA. Because we extended our analysis to include the  $\beta$ 3 stalk domain mutants we characterized in our previous work, <sup>10</sup> to maintain consistency, we converted the fibrinogen binding data to the apparent free energy of fibrinogen binding (  $G_{app}$ ) as defined by eq 2:

$$\Delta G_{\text{app}} = -RT \ln \left( \frac{\text{activation index}}{1 - \text{activation index}} \right)$$
 (2)

#### **Database Curation of Nonredundant Protein Structures To Query Interaction Motifs.**

To rationalize the strengths of  $\alpha \text{IIb}\beta 3$  mutant stalk interactions, we developed a structural bioinformatics analysis method based on the hypothesis that disrupting  $\alpha \text{IIb}$  and  $\beta 3$  stalk interactions that are over-represented in the PDB<sup>17</sup> would destabilize the resting  $\alpha \text{IIb}\beta 3$  heterodimer and hence activate  $\alpha \text{IIb}\beta 3$ . We curated a data set of crystallographic structures from the PDB (accessed February 7, 2018) with 30% sequence identity, 2 Å resolution, an R value of 0.3, and a MolProbity<sup>18</sup> score of <2 to evaluate clashing and rotamer/ $\phi/\psi$  geometry, resulting in a database of 8415 structures. Biological assemblies were then reconstructed using ProDy<sup>19</sup> to maintain interactions across different monomers.

#### Decomposition of Hot Spot Interactions into Fragments for Database Searching.

Next, we discretized putative hot spot interactions into fragments to query our nonredundant PDB data set for the same interaction geometry between fragments. For each putative hot spot residue with experimentally derived functional data, we determined its opposite subunit

interacting fragments using the program Probe, <sup>20</sup> first minimizing the *a*IIb *\beta*3 crystal structure using Rosetta's minimize\_ppi application. <sup>21,22</sup> Each intersubunit contact Probe classified as a hydrogen bond, close contact, or strong atomic overlap was discretized into fragments belonging to a single residue that could fall within a plane. Fragments from side chains with tetrahedral geometry were limited to three atoms if the fragment contained an sp<sup>3</sup>-hybridized carbon, while fragments could contain at least three atoms if one or more atoms were sp<sup>2</sup>-hybridized or aromatic. Fragments from a single residue could also arise from backbone atoms ([N, CA, C] or [CA, C, O]). For example, aspartic acid fragments could be [N, CA, C], [CA, C, O], [N, CA, CB], [C, CA, CB], [CA, CB, CG], or [CB, CG, OD1, OD2]. However, we evaluated the interaction geometry for backbone fragments only if they originated from a complementary subunit residue rather than a putative hot spot residue, because interactions from backbone fragments of a hot spot residue would not be eliminated upon mutating the hot spot residue to alanine.

#### **Database Search for Geometric Matches of Integrin Interactions.**

To determine the favorability of the intersubunit interactions, we searched the nonredundant protein data set for residue pairs that had fragments interacting in the same geometry as in the WT crystal structure (PDB entry 3FCS). For each interaction between a hot spot residue  $AA_h$  and its complementary residue,  $AA_h$ , we approximated the energetic contribution imparted by forming an interaction in that specific geometry as Geom(h). This term was defined as the observed fraction of database  $AA_h$  interactions with  $AA_i$  occurring in the same geometry as in the  $\alpha \text{IIb}\beta 3$  crystal structure, normalized by the expected fraction of residue AA<sub>h</sub> coming into contact with AA<sub>i</sub> if there were no geometrical preference for the interaction. The observed fraction of AA<sub>h</sub> interactions with AA<sub>i</sub> that were geometric matches to the  $\alpha$ IIb $\beta$ 3 crystal structure was defined as the number of database residue pairs whose fragments could be superimposed onto the interacting fragments in the  $\alpha \text{IIb}\beta 3$  crystal structure with a 0.5 Å root-mean-square deviation ( $M_{\text{Igrag}a\Pi\beta}$ ,  $f_{\text{rag}\beta}$ ]<sub>integrin</sub>), normalized by the total number of  $AA_h - AA_i$  residue pairs in the database  $\{MAA(frag \alpha IIB), AA(frag \beta 3)\}\}$ . The expected frequency of this pairwise interaction, assuming no preference for geometry, was defined as the product of the independent frequencies of each amino acid occurring in the database (denominator in eq 3). To account for residue pairs that were in contact simply because of sequence proximity, and not necessarily because of favorable interactions, we included only residue pairs on the same chain if they were separated by at least 10 residues. Calculations were performed using the Python package NumPy,<sup>23</sup> and plots were created using the Python package Matplotlib.<sup>24</sup>

$$Geom(h) = \sum_{\text{(fragglipfrag33)}} - RT$$

$$\times \ln \left\{ \frac{M_{\text{[fragcllp'frag}\beta3]_{\text{integin}}}/N_{\text{[AA(fragaII}\beta), AA(frag}\beta3)]}}{f_{\text{[AA(fragall}\beta)]}f_{\text{[AA(frag}\beta3)]}} \right\}$$
(3)

#### Molecular Model of the Distal allb \beta Stalk.

The stalk domains of aIIb $\beta$ 3were modeled using the molecular visualization tool PyMOL (The PyMol Molecular Graphics System, version 2.0, Schrödinger, LLC) and the X-ray

diffraction crystal structures of  $\alpha$ IIb $\beta$ 3 obtained from the RCSB Protein Data Bank [entry 3FCS (https://www.ncbi.nlm.nih.gov/pubmed/19111664)]. The  $\alpha$ IIb $\beta$ 3 stalk domain model encompassed  $\alpha$ IIb residues 599–959 and  $\beta$ 3 residues 483–691.

#### **RESULTS**

Computational Alanine Scanning of the  $\alpha IIb$  Calf-1 and Calf-2 Domains Identifies Mutation-Sensitive Residues.

Crystal structures of the ectodomain of inactive  $\alpha \text{IIb}\beta 3$  revealed a large interface between the Calf-1 and Calf-2 domains of the  $\alpha$ IIb stalk and the EGF-3, EGF-4, and  $\beta$ TD domains of the distal \(\beta\) stalk<sup>4,25</sup> (Figure 1). Previously, we used the Robetta alanine scanning algorithm to predict destabilizing alanine replacements in the \( \beta \) stalk and found that introducing these replacements into full-length  $\alpha$ IIb $\beta$ 3 caused constitutive  $\alpha$ IIb $\beta$ 3 activation. <sup>10</sup> Using the same method to determine hot spots in the  $\alpha$ IIb stalk, we identified 12 alanine replacements G's ranging from 0.1 to 1.8 kcal/mol (Table 1). To determine which replacements destabilized the interface of the stalk sufficiently to cause  $\alpha \text{IIb}\beta 3$  activation, we introduced 10 of the replacements into full-length  $\alpha$ IIb by site-directed mutagenesis, stably co-expressed the mutants with WT  $\beta$ 3 in CHO cells, and measured both constitutive and dithiothreitol-induced fibrinogen binding to subclones selected by fluorescenceactivated cell sorting analysis for comparable expression of  $\alpha \text{IIb}\beta 3$ . To ensure that results were not unique to a particular subclone, fibrinogen binding measurements were performed using two to six different subclones. To normalize the activity of the various  $\alpha \text{IIb}\beta 3$ mutants, we calculated an aIIb \beta 3 activation index, the ratio of constitutive fibrinogen binding to  $\alpha \text{IIb}\beta 3$  to maximal fibrinogen binding induced by dithiothreitol. The R751A mutant was not expressed, implying that R751 may be important for either correct aIIb folding or correct  $\alpha$ IIb $\beta$ 3 assembly. Each of the other mutants was expressed to a comparable extent and caused a variable degree of constitutive  $\alpha \text{IIb}\beta 3$  activation, with  $\alpha$ IIb $\beta$ 3 activation indices ranging from  $0.83 \pm 0.12$  for V760A to  $0.17 \pm 0.02$  for H787A (Table 1).

Mapping Experimentally Determined Activation Indices onto the Structure of the  $allb\beta$ 3 Stalk Reveals the Relative Positioning and Molecular Contacts of Hot Spot and Neutral Residues.

We then mapped the hot spots we identified in  $\alpha IIb$ , and those we previously identified in  $\beta 3$ ,  $^{10}$  onto the model of the stalk heterodimer shown in Figure 2. Hot spot residues whose alanine mutants promoted  $\alpha IIb\beta 3$  activation were found to lie along a discontinuous strip running through the stalk interface. In the assembled stalk heterodimer, residues having high activation indices when replaced with alanine (i.e., 0.4) were flanked by hot spot residues whose alanine mutants activate  $\alpha IIb\beta 3$  to a lesser extent. By contrast,  $\beta 3$  residues D552 and H626, chosen as negative controls because they do not make intersubunit contacts with  $\alpha IIb$ , were predicted to have no effect on  $\alpha IIb\beta 3$  heterodimer stability  $^{10}$  and did not cause constitutive  $\alpha IIb\beta 3$  activation (Table 1).

# Computational Alanine Scanning Algorithms Inaccurately Capture the Energetics of aIIb $\beta$ 3 Stalk Mutations.

As we previously observed for the  $\beta$ 3 stalk,  $^{10}$  the Robetta alanine scanning algorithm did not correctly rank the functional importance of the hot spots it predicted in the  $\alpha$ IIb stalk (Figure S1). Because the recently reported flex ddG algorithm calculates more accurate G s,  $^{12}$  we repeated the computational alanine scanning using the newer method. To comprehensively examine the whole stalk interface, we extended our analysis to include the  $\beta$ 3 mutants characterized in our previous work.  $^{10}$  When we plotted the apparent free energy of binding (G<sub>app</sub>) of fibrinogen to mutant  $\alpha$ IIb $\beta$ 3 versus the G's predicted by flex ddG, we again found only a weak correlation (Figure 3A;  $R^2 = 0.000$ ), likely because the energetic differences between the integrin mutants are within a very small range. The largest and smallest activation indices for the  $\alpha$ IIb $\beta$ 3 mutants differ by a factor of only 4.8, corresponding to an energetic change of only 1-2 kcal/mol, close to the expected flex ddG error of  $\pm 0.96$  kcal/mol.  $^{12}$ 

# Hot Spot Residues with High Activation Indices Interact with Complementary Residues in Geometries That Are Prevalent in the PDB.

To more accurately assess the energetic contribution of individual  $\alpha IIb$  and  $\beta 3$  residues to the stability of resting  $\alpha IIb\beta 3$ , we investigated whether hot spot residues impart stability in a predictable manner that could be ascertained by evaluating their interaction geometry. For each  $\alpha IIb$  or  $\beta 3$  residue whose alanine mutant was experimentally characterized, we identified the complementary residues with which it interacted and represented the interaction as single-residue fragment pairs so that we could query the nonredundant PDB for pairs of fragments that interact in the same geometry as in the  $\alpha IIb\beta 3$  crystal structure. The nonredundant data set was then searched for geometric matches to WT  $\alpha IIb\beta 3$ , which we defined as residue pairs whose fragments had a low root-mean-square deviation (0.5 Å) with the interacting fragment pairs in the  $\alpha IIb\beta 3$  crystal structure.

As anticipated, hot spot residues with high activation indices interacted with complementary subunit residues in geometries that are highly represented in the nonredundant PDB. Details of these interactions are shown in Figure 4 and listed in Table S2. For example, the hot spot residues whose alanine mutants have the highest activation indices,  $\beta$ 3 T603 and  $\alpha$ IIb V760, have numerous geometric matches. T603, whose activation index is 0.86, has a total of 385 geometric matches with six fragments on four  $\alpha$ IIb residues. V760, whose activation index is 0.83, has 2940 geometric matches with one residue on  $\beta$ 3. By contrast,  $\alpha$ IIb residue I673, whose activation index is 0.23, has only 54 geometric matches. Mutants that do not cause integrin activation relative to WT (i.e.,  $\beta$ 3 D552A and  $\beta$ 3 H626A) do not make any intersubunit interactions and have zero geometric matches in the PDB.

Figure 2. Mapping of functional hot spots identified by alanine scanning mutagenesis onto the structures of the  $\alpha$ IIb and  $\beta$ 3 stalk domains. The locations of residues in the distal  $\alpha$ IIb and  $\beta$ 3 stalk domains for which alanine replacements caused constitutive  $\alpha$ IIb $\beta$ 3 activation were mapped onto the structures for these domains and are color-coded according to the apparent free energy of fibrinogen binding ( $G_{app}$ ) of their alanine replacement (Table 1), as shown in the heat map below the models.

#### **Quantitative Analysis of Interaction Geometry.**

On the basis of our findings that frequently represented interaction geometries are present at the  $\alpha$ IIb $\beta$ 3 stalk interface, we developed a simple scoring function, Geom(h), to score the geometric interaction propensities of hot spot residue h (eq 3). We found a strong correlation between the Geom(h) score of a residue and the ability of its alanine replacement to cause  $\alpha$ IIb $\beta$ 3 activation. The Geom(h) scores for strongly activating  $\beta$ 3 T603 and  $\alpha$ IIb V760 were -3.75 and -2.91, respectively, while those for less activating  $\alpha$ IIb residues I673 and N753 were 0.16 and -1.87, respectively. When we examined the quantitative agreement between the Geom(h) scores and the apparent energies of binding to fibrinogen, we found the correlation coefficient to be 0.796 (Figure 3B).

Nonetheless, there were two notable discrepancies between the computational alanine scanning and the structural bioinformatics results. First,  $\alpha$ IIb S758 makes no direct interchain contacts, but its alanine replacement has a high activation index of 0.64. However, the  $\alpha$ IIb $\beta$ 3 crystal structure is not well-resolved in this region, as evidenced by the side chains of Q954/L956 of  $\alpha$ IIb and K612/K658 of  $\beta$ 3 not being represented in the electron density maps. Moreover, there is unassigned density corresponding to two volumes that could potentially be in contact with S758, suggesting that there may be solvent-mediated interchain interactions for which the bioinformatics method does not account (Figure 4).

The second exception is  $\beta$ 3 E534. Previously, using Robetta alanine scanning, we predicted that E534A was moderately destabilizing with a G of 0.54 kcal/mol. <sup>10</sup> On the basis of the crystal structure of inactive a IIb \(\beta\_3\), \(\beta\_3\) E534A does not disrupt an interaction across the aIIbβ3 stalk interface. Rather, it disrupts a hydrogen bond between the β3 EGF-3 domain and the  $\alpha$ IIb  $\beta$ -propeller located in the  $\alpha$ IIb ectodomain (Figure 5), causing constitutive  $\alpha$ IIb $\beta$ 3 activation with an activation index of 0.76  $\pm$  0.07. The structural bioinformatics analysis revealed that E534 interacts with  $\beta$ -propeller residue R402 with a Geom(h) score of -1.19, an intermediate degree of geometric favorability relative to the stalk mutants. However, E534A is more activating than its geometry score would suggest. Thus, while these results confirm that the structural bioinformatics method can describe favorable interaction geometries across different regions in multidomain proteins, it also cautions that without carefully training the model on a large database of interdomain interactions, we can rank only the favorability of those interactions within the same interface. E534 is also noteworthy because Zang and Springer had previously reported that mutating  $\beta$ 2 residue Q535, analogous to  $\beta$ 3 E534, as well as  $\beta$ 2 V526, both located in the  $\beta$ 2 EGF-3 domain, caused the activation of leukocyte integrin  $\alpha \times \beta 2$  (CD11c/CD18) and postulated that an interaction between these residues and unidentified residues in  $\alpha x$  restrained  $\alpha x \beta 2$  in its inactive state. 25 Our results suggest that the inactive state of  $\alpha x \beta 2$  is stabilized through an interaction similar to the  $\beta$ 3 E534– $\alpha$ IIb R402 interaction and further support the bent conformation as a biologically relevant state for this class of integrins.

#### DISCUSSION

Platelets circulate in a milieu that is rich in fibrinogen, the principal ligand for integrin  $\alpha \text{IIb}\beta 3$ . Because binding of fibrinogen to activated  $\alpha \text{IIb}\beta 3$  causes platelet aggregation,  $\alpha \text{IIb}\beta 3$  on circulating platelets is held in an inactive state by an intramolecular clasp

composed of portions of its cytosolic, TM, and extracellular stalk domains to prevent the formation of intravascular platelet aggregates.  $^{26-28}$  At sites of vascular injury where rapid platelet aggregation is required to stop bleeding, platelet stimulation causes disruption of the clasp, followed by a global  $\alpha$ IIb $\beta$ 3 rearrangement during which its ectodomain extends and exposes its fibrinogen-binding site.  $^5$ 

In crystal structures<sup>2,3</sup> and electron microscope images<sup>5,29</sup> of the extracellular domain of inactive  $\alpha IIb\beta 3$ , the lower leg of  $\beta 3$  is in the proximity of both the lower  $\alpha$  leg and the integrin headpiece. One proposed trigger for the global rearrangement is the release of intersubunit contacts located in the stalk domain, thereby allowing the  $\alpha$ IIb and  $\beta$ 3 components of the stalk to separate and the ectodomain to extend.<sup>30,31</sup> Lending support for this mechanism, three families with the inherited bleeding disorder Glanzmann thrombasthenia have been reported in whom deletion of  $\beta$ 3 residues D647–E686<sup>32</sup> or  $\beta$ 3 residues D621–E660,  $^{33}$  containing the predicted  $\beta$ 3 hot spots K658 and V644, caused constitutive aIIb \(\beta\) activation. Previously, Kamata et al. also reported that swapping the Calf2 domains of aIIb and av enhanced Mn<sup>2+</sup>-induced fibringen binding to aIIb \(\beta\)3 but suppressed Mn<sup>2+</sup>-induced fibringen binding to  $\alpha v \beta 3$ , suggesting that the interface between the  $\alpha$ subunit Calf-2 domain and the  $\beta$ 3 EGF-4 and  $\beta$ TD domains regulates Mn<sup>2+</sup>-induced ligand binding to  $\alpha IIb\beta 3$  and  $\alpha v\beta 3$ . <sup>34</sup> Consistent with this conclusion, Mn<sup>2+</sup>-induced fibringen binding to  $\alpha \text{IIb}\beta 3$  was suppressed by an artificial disulfide bridge between the  $\alpha$ IIb Calf-2 and  $\beta$ 3  $\beta$ TD domains. However, neither the Calf-2 domain swaps nor subsequent residue interchanges caused integrin activation in the absence of Mn<sup>2+</sup>. Mn<sup>2+</sup> by itself is a weak integrin activator, and neither the  $\alpha$ IIb Calf-2 nor the  $\beta$ 3 EGF-4- $\beta$ TD domains bind cations. Thus, it is likely that perturbations in the interface between the  $\alpha$ -and β-subunit stalks introduced by the Calf-2 domain swaps potentiated an effect of Mn<sup>2+</sup> elsewhere in the  $\alpha \text{IIb}\beta 3$  and  $\alpha v\beta 3$  molecules. It has also been proposed that in bent integrins, the CD loop of the  $\beta$ 3  $\beta$ TD domain contacts the  $\beta$ 3  $\beta$ A domain  $F/\alpha_7$  loop, acting as a "deadbolt" to prevent the allosteric movement of the  $\alpha$ 7 helix that initiates opening of the integrin headpiece. 35 However, neither deleting nor mutating the CD loop perturbs ligand binding to a IIbB3. 36 making it doubtful that these CD loop interactions regulate integrin function.

To identify hot spot interactions in the  $\alpha$ IIb and  $\beta$ 3 stalks that regulate  $\alpha$ IIb $\beta$ 3 function, we used the computational alanine scanning algorithm hosted on Robetta to predict interacting hot spots in the stalk heterodimer, initially identifying nine alanine replacements in  $\beta$ 3<sup>10</sup> and then 12 alanine replacements in  $\alpha$ IIb with predicted G's ranging from 0.06 to 2.89 kcal/mol. Hot spots have been variably defined as residues whose replacement by alanine destabilizes a protein–protein interface by G's ranging from >1.0 to >4.0 kcal/mol. <sup>8,9,11,37</sup> It is noteworthy that only 8 of 21 alanine replacements had a predicted G of >1.0 kcal/mol (Table 1), a proposed threshold for a destabilizing alanine replacement. <sup>11,13</sup> Furthermore, there was only a weak correlation ( $R^2 = 0.35$ ) between the G's predicted by the Robetta algorithm and the extent of  $\alpha$ IIb $\beta$ 3 activation that occurred when the alanine replacement was introduced into  $\alpha$ IIb $\beta$ 3 (Figure S1).

The recently reported flex ddG protocol generates ensembles of structures using the "backrub" protocol in Rosetta, thereby accounting for mutation-induced local side chain and

backbone conformational changes. Flex ddG has been found to outperform other existing computational methods that also sampled conformational space, particularly for small to large mutations. Nonetheless, there still was only a weak correlation between flex ddG and the energy of fibrinogen binding to  $\alpha \text{IIb}\beta 3$  (Figure 3A) because the effects we measured were small and within the margin of error of flex ddG.

To better understand the structural basis for  $\alpha \text{IIb}\beta$  activation, we developed a structural bioinformatics approach to analyze functionally important contacts in both the  $\alpha$ IIb and  $\beta$ 3 stalks. This approach was based on the hypothesis that functional groups have preferences in the relative position, orientation, and angles at which they interact, and these preferences are reflected in the PDB. Analyses of side chain interactions in the PDB have shown that propensities of these interactions deviate from the distributions expected from random packing, implying that side chain interactions are guided by directional preferences. 38-40 Taking this into account, we approximated the energetic contribution of a hot spot residue by identifying its interacting fragment pairs and querying the PDB for the prevalence of those interaction geometries. We found a strong correlation between our interaction geometry term and the binding energy of fibrinogen to  $\alpha \text{IIb}\beta 3$  ( $R^2 = 0.796$ ) (Figure 3B). Thus, this approach shows promise for analyzing putative hot spots identified by alanine scanning. However, a much larger data set would need to be examined, and the choice of molecular interaction fragments would likely need to be optimized to generalize this method over a wide range of molecular interactions. Nonetheless, the ability to assess favorable interaction geometry through a knowledge-based method precludes the need to directly model mutation-induced structural changes as well as the need to directly calculate energetic effects. Ultimately, the interaction geometry metric can be incorporated into Rosetta, facilitating analysis of interaction geometry for interface evaluation and design.

### **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

#### **ACKNOWLEDGMENTS**

This work was supported by National Institutes of Health Grants P01 HL40387 (J.S.B. and W.F.D.) and R35 GM122603 (W.F.D.) as well as National Science Foundation (NSF) Grant 1709506 (W.F.D.). S.K.T. is supported by the NSF under Grant 1650113.

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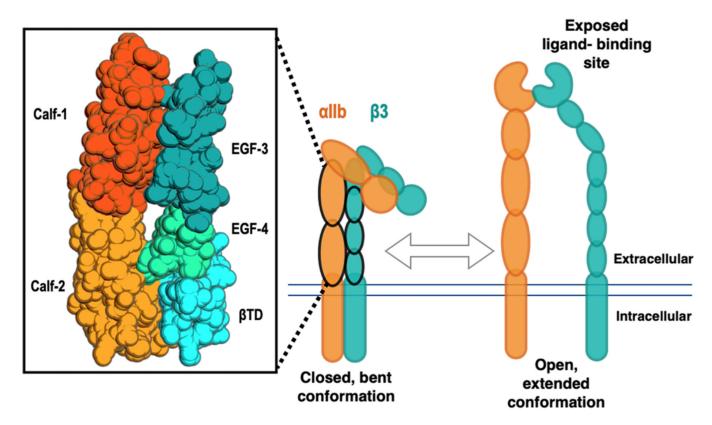


Figure 1. Model of  $\alpha$ IIb $\beta$ 3 undergoing a global conformational shift between its bent inactive and its extended ligand-binding states. The inset is a space-filling model of the distal  $\alpha$ IIb $\beta$ 3 stalk domains that encompasses  $\alpha$ IIb resides 599–959 and  $\beta$ 3 residues 483–691<sup>4</sup> and is derived from the Xray crystal structures shown in Protein Data Bank entry 3FCS.

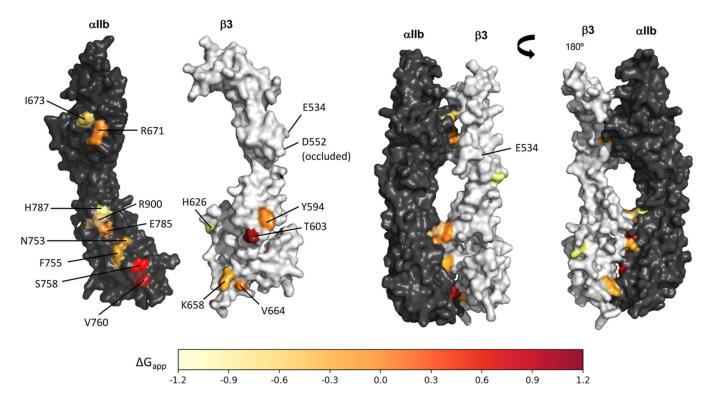


Figure 2. Mapping of functional hot spots identified by alanine scanning mutagenesis onto the structures of the  $\alpha$ IIb and  $\beta$ 3 stalk domains. The locations of residues in the distal  $\alpha$ IIb and  $\beta$ 3 stalk domains for which alanine replacements caused constitutive  $\alpha$ IIb $\beta$ 3 activation were mapped onto the structures for these domains and are color-coded according to the apparent free energy of fibrinogen binding ( $G_{app}$ ) of their alanine replacement (Table 1), as shown in the heat map below the models.

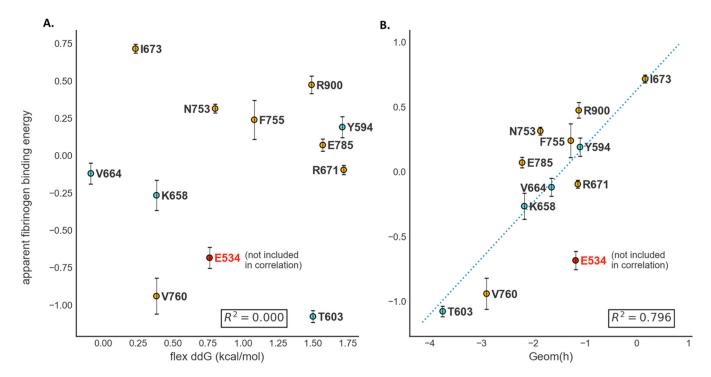


Figure 3. Correlation between the apparent fibrinogen binding energy of the activating alanine replacements in the  $\alpha$ IIb and  $\beta$ 3 stalks and (A) the corresponding G5 predicted by flex ddG or (B) the corresponding Geom(h) scores calculated from the structural bioinformatics analysis. The G values predicted by flex ddG are shown in Table 1, and corresponding Geom(h) scores are listed in Table S2. Changes in the apparent energy of fibrinogen binding resulting from the scanning mutagenesis of the  $\alpha$ IIb $\beta$ 3 stalks with alanine replacements were calculated using eq 3.  $\beta$ 3 residue E534A was excluded from the correlation because it is not located in the stalk domain interface.

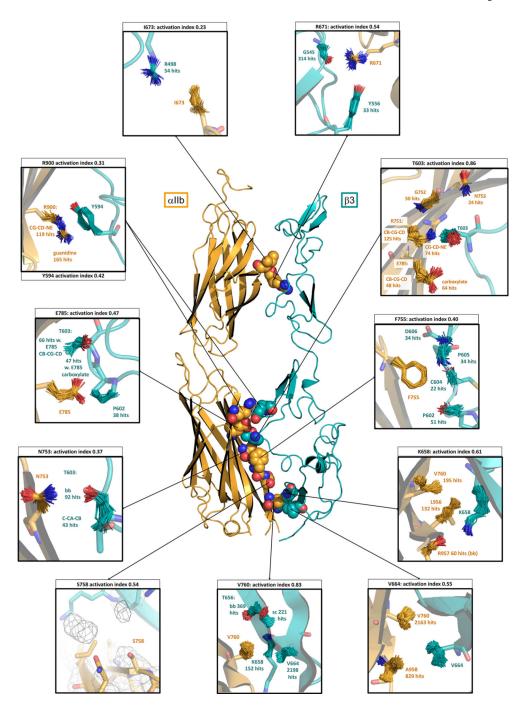


Figure 4. Favorability of the interaction geometry between  $\alpha$ IIb and  $\beta$ 3 stalk domains determined from knowledge-based structural bioinformatics. The  $\alpha$ IIb stalk is colored orange, and the  $\beta$ 3 stalk is colored cyan. Activation index values were derived from Table 1.  $\alpha$ IIb or  $\beta$ 3 residues and their complementary interacting residues, as well as the number of geometric matches in the PDB, were determined using structural bioinformatics as described in Methods and are listed in Table S2.

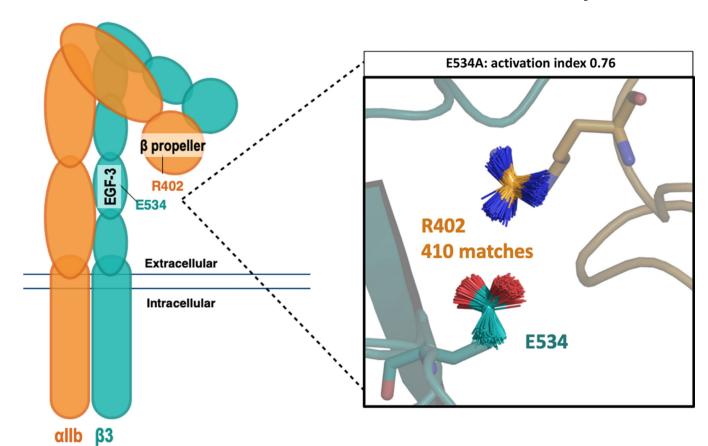


Figure 5. Alanine replacement of  $\beta$ 3 residue E534 causes constitutive  $\alpha$ IIb $\beta$ 3 activation by disrupting the interaction of E534 with  $\alpha$ IIb $\beta$ -propeller residue R402. Replacing predicted  $\beta$ 3 residue E534 with alanine causes robust  $\alpha$ IIb $\beta$ 3 activation with an AI of 0.76 (Table 1). However, E534 is not interfacial, but it is in direct contact with  $\alpha$ IIb residue R402 located in the  $\alpha$ IIb $\beta$ -propeller domain.

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Table 1.

Comparison of Integrin  $\alpha$ IIb and  $\beta$ 3 Stalk Domain Hot Spots and the  $\alpha$ IIb $\beta$ 3 Activation Index

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mutation	subunit	Robetta alanine scanning (kcal/mol)	aIIbβ3 activation index	Rosetta flex ddG (kcal/mol)
F669A	aIIb	0.88		0.65
R671A	aIIb	1.53	$0.54\pm0.03$	1.72
I673A	aIIb	0.12	$0.23\pm0.03$	0.23
N691A	aIIb	0.62	-	2.20
R751A	aIIb	1.49	-	0.65
N753A	aIIb	1.32	$0.37 \pm 0.03$	0.80
F755A	aIIb	1.76	$0.40\pm0.13$	1.08
S758A	aIIb	0.56	$0.64\pm0.10$	-0.04
V760A	aIIb	0.71	$0.83 \pm 0.12$	0.38
E785A	aIIb	1.20	$0.47\pm0.04$	1.57
H787A	aIIb	0.06	$0.17\pm0.02$	-0.06
R900A	aIIb	0.54	$0.31 \pm 0.06$	1.49
Q497A	<b>β</b> 3	1.98	-	1.86
E534A	<b>β</b> 3	0.54	$0.76\pm0.07$	0.76
D552A	<b>β</b> 3	0	$0.17\pm0.04$	0.03
Y556A	<b>β</b> 3	0.40	-	0.05
Y594A	<b>β</b> 3	0.60	$0.42\pm0.07$	1.71
T603A	<b>β</b> 3	2.89	$0.86 \pm 0.04$	1.50
D606A	<b>β</b> 3	0.71	-	0.42
T609A	<b>β</b> 3	1.42	-	0.29
H626A	<b>β</b> 3	0	$0.19\pm0.05$	0
K658A	<b>β</b> 3	0.63	$0.61 \pm 0.10$	0.38
V664A	<i>β</i> 3	0.34	$0.55\pm0.02$	-0.09