

Acidic Extracellular pH Promotes Activation of Integrin $\alpha_v\beta_3$

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Abstract

Acidic extracellular pH is characteristic of the cell microenvironment in several important physiological and pathological contexts. Although it is well established that acidic extracellular pH can have profound effects on processes such as cell adhesion and migration, the underlying molecular mechanisms are largely unknown. Integrin receptors physically connect cells to the extracellular matrix, and are thus likely to modulate cell responses to extracellular conditions. Here, we examine the role of acidic extracellular pH in regulating activation of integrin $\alpha_v\beta_3$. Through computational molecular dynamics simulations, we find that acidic extracellular pH promotes opening of the $\alpha_v\beta_3$ headpiece, indicating that acidic pH can thereby facilitate integrin activation. This prediction is consistent with our flow cytometry and atomic force microscope-mediated force spectroscopy assays of integrin $\alpha_v\beta_3$ on live cells, which both demonstrate that acidic pH promotes activation at the intact cell surface. Finally, quantification of cell morphology and migration measurements shows that acidic extracellular pH affects cell behavior in a manner that is consistent with increased integrin activation. Taken together, these computational and experimental results suggest a new and complementary mechanism of integrin activation regulation, with associated implications for cell adhesion and migration in regions of altered pH that are relevant to wound healing and cancer.

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Introduction

Binding between cells and the extracellular matrix (ECM) is critical to complex processes such as cell adhesion and migration. This binding is mediated by interactions between cell surface integrin receptors and ECM ligands. Integrins are heterodimeric α/β transmembrane receptors which bind to ECM ligands such as fibronectin [1]. These receptors contain several metal ion binding sites; three of these sites, termed LIMBS, MIDAS, and ADMIDAS, are involved in regulation of integrin-ligand binding [2,3]. Intracellularly, integrins can link to the actin cytoskeleton via a multi-protein assembly and also interact with signaling proteins that regulate processes such as cell survival and proliferation [4].

Integrins undergo large-scale conformational changes in order to attain a high-affinity configuration during the process of integrin activation. These receptors are currently understood to exist in equilibrium among three main conformational states (Fig. 1). In the low-affinity state, the extracellular leg domains are bent and the headpiece is closed, with an acute angle between the I-like and hybrid domains. This conformation generally exhibits little to no binding to biological ligands [5,6,7,8], but can bind to small RGD peptides in solution [9]. In the high-affinity conformation, the leg domains are extended and separated, and the headpiece is open. The third conformation, with extended legs and a closed headpiece, is expected to be of intermediate affinity [5].

Integrin activation can be regulated by signals from the extracellular (“outside-in”) and intracellular (“inside-out”) environments. During outside-in activation, the headpiece-tailpiece interface is destabilized by headpiece opening. This is followed by extension and separation of the leg domains, resulting in adoption of the extended-open conformation [5,7]. Outside-in activation can be regulated by divalent cations; for example, Mn^{2+} promotes activation while Ca^{2+} stabilizes the low-affinity conformation [5,10,11]. Integrins can also be activated by ligand or antibody binding [5,12]. Inside-out activation begins with separation of the α and β tails and results in adoption of the extended-closed conformation [5], and is regulated by intracellular signals such as talin binding to the integrin cytoplasmic domain [6,8].

It is well known that extracellular pH can become acidic in several biological contexts. For example, while normal physiological pH is 7.4, the average extracellular pH in the tumor environment is generally in the range of 6.2–6.9 [13,14,15,16]. In early stages of wound healing, the extracellular pH is in the range of 5.7–6.1 [17]. In addition, a cell can locally acidify its environment through the action of the Na^+/H^+ ion exchanger NHE1, which extrudes an intracellular H^+ ion in exchange for an extracellular Na^+ ion. Interestingly, it has been shown that NHE1 localizes to adhesion sites [18,19], and could thus selectively acidify the extracellular environment proximal to the integrin receptors. In motile cells, NHE1 localizes to leading edge

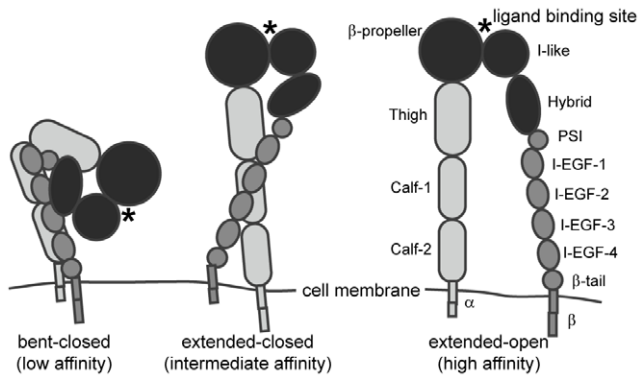


Figure 1. Integrins exhibit three distinct conformations correlated with binding affinity. Headpiece domains are depicted in black. In the low affinity conformation, the integrin leg domains are bent and the headpiece is closed. In the intermediate affinity conformation, the leg domains are extended and the headpiece is closed. In the high affinity conformation the leg domains are extended, and the headpiece is open.
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membrane protrusions [20], thereby creating a pH gradient at the single cell level, with a lower pH at the leading edge [21,22]. It should be noted that NHE1 can also regulate cell migration via mechanisms independent of its function as an ion exchanger [18], although its role as a proton pump is most relevant to this study.

Acidic extracellular pH can affect several cell processes, including adhesion and migration. For example, adhesion between neutrophils and endothelial cells was found to strengthen when the extracellular environment was acidified [23]. In addition, human melanoma cells exhibited more lamellipodia and stronger adhesion at lower extracellular pH, while migration speed was maximum at intermediate pH [24]. Human melanoma cells also displayed enhanced invasiveness and increased secretion of proteases and proangiogenic factors in response to acidic extracellular pH [25]. Furthermore, mouse metastatic melanoma cells increased in size and elongation ratio, and displayed increased migration capacity and gelatinase secretion after exposure to acidic extracellular pH [26]. In human breast cancer cells, the number and length of filopodia increased at acidic pH [27], and in mouse microglial cells, acidic pH was noted to promote cytoskeletal rearrangement and stress fiber formation [28]. Finally, cell adhesion and proliferation increased when fibroblasts, MG-63, or Saos-2 cells were cultured on vinyl phosphonic acid (VPA)/acrylamide gels with a higher proportion of acidic VPA [29].

While some of these observations have been attributed to changes in intracellular protein expression or protease secretion, the molecular mechanisms facilitating these changes are unknown. In particular, the role of integrin receptors in mediating the observed cellular responses to acidic pH has not been explored in depth. To our knowledge, to date only two studies have addressed this possibility. Stock et al. speculated that an extracellular acid-induced strengthening of the integrin-ligand bond could explain their observed effects of pH on melanoma cell adhesion and migration, but did not directly investigate this hypothesis [24]. Lehenkari and Horton observed that the rupture force between integrin $\alpha_v\beta_3$ and a GRGDSP peptide increased at acidic pH, but did not assess the possible reasons that this occurs [30]. In addition, this result has not been repeated or supported by other molecular-level experiments. Here, we consider the hypothesis that acidic extracellular pH can directly alter integrin conforma-

tion, thereby affecting integrin-ligand binding. Specifically, we employ molecular dynamics simulations, and flow cytometry and molecular force spectroscopy experiments, to investigate the effect of acidic extracellular pH on activation of integrin $\alpha_v\beta_3$. We also conduct cell-level morphology and migration experiments to assess the consequent effects on cell behavior.

Results

Acidic extracellular pH promotes integrin headpiece opening in molecular dynamics simulations

To gain atomistic understanding of how acidic extracellular pH affects integrin conformation, we employed molecular dynamics (MD) simulations. The crystal structure used for these simulations was the extracellular domain of integrin $\alpha_v\beta_3$ in complex with an RGD peptide [9]. Only the integrin headpiece was simulated to reduce the solvated system to a computationally tractable size (Fig. 2A). In the $\alpha_v\beta_3$ crystal structure, the headpiece is closed; this configuration provides an opportunity to study the effect of extracellular pH on headpiece opening *in silico*, independently of other effects that may be coupled *in vitro* and *in vivo*.

We used Multi-Conformation Continuum Electrostatics (MCCE) to predict pK_a values for all titratable residues in the

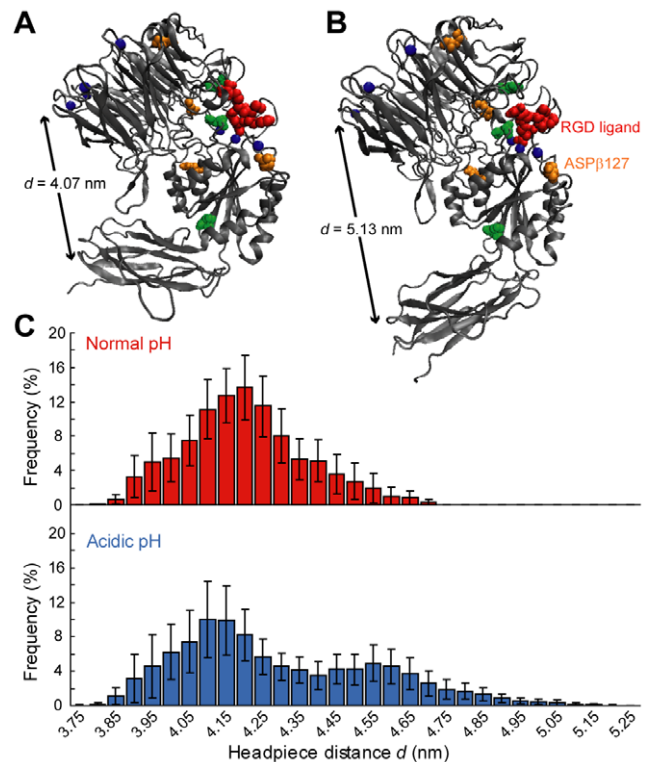


Figure 2. Acidic extracellular pH promotes $\alpha_v\beta_3$ headpiece opening in molecular dynamics simulations. (A) Atomistic rendering of the $\alpha_v\beta_3$ headpiece in a closed conformation. Spheres depict Mg²⁺ ions (blue), RGD ligand (red), residues with elevated pK_a that were protonated at both normal and acidic pH (green) or protonated at acidic pH only (orange). Arrow indicates headpiece opening distance. (B) Atomistic rendering of the $\alpha_v\beta_3$ headpiece in a partially open conformation. (C) Histograms of headpiece opening distances from all recorded frames of every simulation trajectory. Frequencies are displayed as the average of the eight simulations at each pH condition. Error bars represent standard error of the mean (SEM).
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$\alpha_v\beta_3$ headpiece. MCCE predicts pK_a values for residues within the protein context, which can differ appreciably from pK_a of these residues in isolation [31,32]. To simulate normal physiological pH, we protonated residues with $pK_a > 8.4$. For an effective acidic pH, we protonated residues with $pK_a > 6.2$. From the definition of pK_a , these residues would be protonated at a pH below the threshold pK_a of 6.2 for a majority of integrins (>50%), thus computationally approximating an acidic pH on that order; we refer to this state hereafter as “acidic pH.” MCCE results indicated seven amino acids with pK_a values that were elevated from their expected solution values, and were thus protonated in our simulations (Fig. 2A–B, Table 1).

We conducted eight replicate MD simulations (8 ns duration each) of each pH system, and quantified the amount of headpiece opening that occurred. Puklin-Faucher et al. previously observed partial headpiece opening within 6–8 ns of MD simulations of $\alpha_v\beta_3$ in complex with the fibronectin III₁₀ domain [33]. Despite some differences in simulation details, replication of those simulations to the extent possible confirmed that the maximum headpiece opening observed in our simulations is comparable to that reported by Puklin-Faucher et al. At normal physiological pH, a histogram of headpiece opening distances d exhibits a single peak centered at $d = 4.2$ nm. At acidic pH, the histogram exhibits two peaks, centered at $d = 4.1$ nm and 4.55 nm (Fig. 2C). The emergence of this second peak demonstrates that the $\alpha_v\beta_3$ headpiece more frequently samples a partially open state at acidic pH. Although the $\alpha_v\beta_3$ headpiece did not reach the fully open conformation in the timescale of our simulations, the partial headpiece opening we observed is expected to be on the pathway to complete opening [33]. Therefore, these results indicate that acidic extracellular pH promotes opening of the $\alpha_v\beta_3$ headpiece.

ASP β 127, which is protonated in our acidic pH system, is located in the $\alpha 1$ - $\beta 1$ loop at the top of the $\alpha 1$ helix in the I-like domain, and can coordinate the divalent cation at the ADMIDAS site. As movements within the $\alpha 1$ helix have been implicated in headpiece opening [11], we investigated the role of ASP β 127 in the acid-induced headpiece opening observed in our simulations. We established a simulation system identical to the normal physiological pH system, except for the additional protonation of ASP β 127. A histogram of headpiece opening distances for this system revealed three peaks, two of which were shifted to higher distances than the opening distance observed at normal pH (Fig. 3A). This indicates that the headpiece opening observed at acidic pH could be at least partially attributed to protonation of the ASP β 127 residue.

Table 1. Residues with elevated pK_a values as predicted by MCCE.

Residue	Predicted pK_a
GLU α 123	11.933
ASP β 217	8.53
HIS β 244	8.492
HIS α 91	6.223
ASP α 186	7.109
ASP β 127	6.692
HIS β 274	7.103

GLU α 123, ASP β 217, and HIS β 244 were protonated both the normal and acidic pH systems. HIS α 91, ASP α 186, ASP β 127, and HIS β 274 were protonated in the acidic system only.

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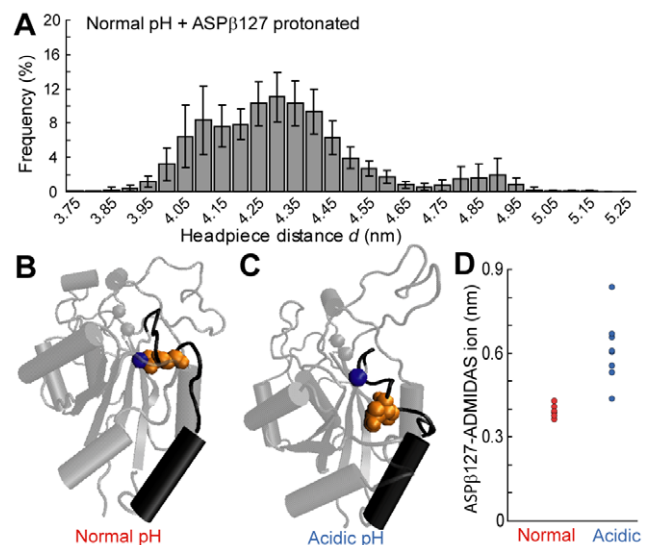


Figure 3. Increased headpiece opening at acidic extracellular pH can be attributed in part to ASP β 127 protonation. (A) Histogram of headpiece opening distances displayed as in Fig. 2. (B) Snapshot of the $\alpha_v\beta_3$ I-like domain in the normal pH system demonstrating ASP β 127-ADMIDAS ion coordination. ADMIDAS ion is displayed as a blue sphere, ASP β 127 is displayed in orange spheres, and the $\alpha 1$ - $\beta 1$ loop and $\alpha 1$ helix are displayed in black. (C) Snapshot of the $\alpha_v\beta_3$ I-like domain in the acidic pH system demonstrating the lack of ASP β 127-ADMIDAS ion coordination. (D) Average distances between the centers-of-mass of the ADMIDAS ion and ASP β 127 in each simulation trajectory. Error bars (SEM) are within data points. doi:10.1371/journal.pone.0015746.g003

At normal physiological pH, ASP β 127 is negatively charged and coordinates the ADMIDAS ion (Fig. 3B). When ASP β 127 is protonated at acidic pH, it has neutral charge and no longer coordinates the ADMIDAS ion (Fig. 3C). This is demonstrated by the distance between ASP β 127 and the ADMIDAS ion, which is much shorter at normal pH (Fig. 3D). We suggest that the loss of ASP β 127-ADMIDAS ion coordination at acidic pH increases the likelihood that the $\alpha 1$ - $\beta 1$ loop and $\alpha 1$ helix sample displacements that promote headpiece opening.

Our simulations demonstrate that acidic pH promotes opening of the $\alpha_v\beta_3$ headpiece, attributable in part to protonation of ASP β 127 in the I-like domain. Headpiece opening in the bent-closed conformation destabilizes the bent state and is expected to lead to integrin extension [7,34,35]. Therefore, our MD simulations indicate that acidic pH will shift the integrin conformational equilibrium towards the fully activated extended-open state, independently of other possible downstream effects of extracellular acidification.

The level of activated $\alpha_v\beta_3$ on live cell surfaces increases after exposure to acidic pH

To investigate the effect of acidic pH on integrin activation on live cell surfaces, we conducted flow cytometry experiments with the antibody WOW-1 Fab, which preferentially binds to activated $\alpha_v\beta_3$ [36]. We measured the level of activated $\alpha_v\beta_3$ on live $\alpha_v\beta_3$ CHO-B2 cell surfaces after incubation in buffer pH over the range 6.0–8.0. Cell shrinkage and detachment indicated a decrease in cell viability at $pH \leq 5.5$; therefore these lower pH values were not assessed via flow cytometry. Control experiments with various divalent cations confirmed WOW-1 specificity as a marker of activated $\alpha_v\beta_3$ (Fig. 4A). Ca^{2+} ions stabilize the inactive

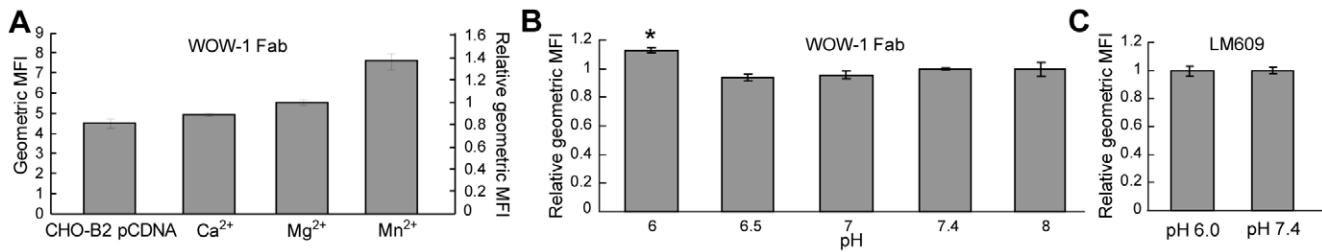


Figure 4. Flow cytometry measurements demonstrate increased level of activated $\alpha_v\beta_3$ on live cell surfaces after exposure to acidic extracellular pH. (A) WOW-1 Fab binding in the presence of various divalent cations. Data are displayed as the average geometric MFI of triplicate samples from a single representative experiment (primary axis), as well as the normalized geometric MFI (see Methods) expressed relative to the average value measured in the presence of Mg^{2+} ions (secondary axis), to enable direct comparison to (B). (B) WOW-1 Fab binding after exposure to pH 6.0–8.0. Data are normalized geometric MFI (see Methods) at each pH expressed relative to the average value measured at pH 7.4. Averaged data displayed here were calculated from at least two independent experiments at each pH. Asterisk indicates $p < 0.01$ with respect to all other pH conditions. (C) LM609 binding after exposure to pH 6.0 or 7.4. Data is expressed as in (B). All error bars represent SEM.
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conformation [5,10,11], and cells in the presence of Ca^{2+} displayed low levels of WOW-1 binding. Mn^{2+} ions promote activation [5,10,11], and cells exposed to Mn^{2+} displayed the highest level of WOW-1 binding. An intermediate level of WOW-1 binding was observed in the presence of Mg^{2+} , and all pH experiments were performed with this ion. As expected, WOW-1 binding was lowest on CHO-B2 pCDNA cells, which do not express the integrin β_3 subunit. Although the difference in fluorescence intensity between Mn^{2+} -stimulated cells and negative control CHO-B2 pCDNA cells was small (see Fig. S1 for histograms), the fold change we observed is comparable to that reported by others for this antibody [8,36].

The levels of WOW-1 binding after exposure to pH 6.5, 7.0, and 8.0 differed insignificantly from that at physiological pH 7.4; however, exposure to pH 6.0 resulted in a significantly higher level of binding ($p < 0.01$, Fig. 4B). We used antibody LM609, which binds both activated and inactivated $\alpha_v\beta_3$, to assess whether exposure to pH 6.0 changes the total cell surface expression of $\alpha_v\beta_3$. LM609 binding after exposure to pH 6.0 was indistinguishable from that at pH 7.4 (Fig. 4C), confirming no measurable change in the overall level of integrin expression at acidic pH. Therefore, our flow cytometry results indicate that exposure to an acidic pH of 6.0 results in an increased level of activated $\alpha_v\beta_3$ receptors on live cell surfaces.

Frequency of $\alpha_v\beta_3$ -RGD binding increases at acidic pH, but rupture forces are unaffected

To further quantify the conformational state of $\alpha_v\beta_3$ on single cell surfaces, we also conducted atomic force microscope (AFM)-mediated molecular force spectroscopy; this molecular force spectroscopy is defined here as measurement of the distribution of unbinding forces F_R between ligand-receptor complexes upon application of load at a given applied loading rate. Previous studies have utilized AFM force spectroscopy to investigate $\alpha_4\beta_1$ -VCAM-1 and $\alpha_5\beta_1$ -fibronectin interactions on U937 and K562 cells, respectively. In those reports, the applied force required to rupture the induced ligand-receptor complex F_R and binding frequency f_b increased after integrin activation [37,38]. Therefore, we measured both rupture forces and binding frequencies of $\alpha_v\beta_3$ -RGD on live $\alpha_v\beta_3$ CHO-B2 cells, as a function of extracellular pH.

In our experiments, the RGD-functionalized AFM cantilever was positioned over live $\alpha_v\beta_3$ CHO-B2 cells, far from each cell nucleus (Fig. 5A), and 200 force cycles were performed on each cell in a grid pattern. A representative force-displacement trace for a single force cycle is shown in the inset of Fig. 5B.

To distinguish specific $\alpha_v\beta_3$ -RGD interactions from nonspecific binding interactions, we conducted measurements on cells before and after incubation with the antibody LM609, which blocks the RGD binding site on $\alpha_v\beta_3$. It is expected that specific $\alpha_v\beta_3$ -RGD interactions will exhibit rupture forces distributed around a characteristic value corresponding to the strength of this molecular complex at the particular loading rate used here [37,38,39]. The effective loading rate F' should also be distributed around a characteristic value that reflects the stretching behavior of the ligand-receptor complex, molecular linkers, and cell immediately before rupture. These characteristic distributions provided the opportunity to effectively gate the specific interactions for each cell, despite the inherently large variation in experimental responses.

Analysis of rupture forces and effective loading rates before and after blocking demonstrated that unbinding events with $F_R > 50$ pN and $F' > 2000$ pN/s occurred frequently before, but not after, blocking the RGD binding site (Fig. 5B, quadrant II, $16.80 \pm 2.58\%$ vs. only $0.49 \pm 0.49\%$ (mean \pm SEM)). Therefore, rupture events with these characteristics were assumed to be specific $\alpha_v\beta_3$ -RGD interactions, and events in quadrants I, III, and IV were assumed to be nonspecific (or, more accurately, to be events which could not be objectively identified as specific). Additional negative controls were performed with cantilevers functionalized with linker molecules, but without GRGDSPC. In identical experiments conducted with these cantilevers, only $3.68 \pm 1.75\%$ (mean \pm SEM) of the rupture events fell within quadrant II, thereby confirming that events with $F_R > 50$ pN and $F' > 2000$ pN/s were specific interactions that occurred infrequently in negative control experiments. Only these specific interactions were included in further analysis.

We conducted AFM force spectroscopy experiments on cells at pH 7.4 and pH 6.0. We also conducted experiments at pH 7.4 after activating $\alpha_v\beta_3$ with antibody LIBS-6 [12]. Analysis of specific rupture forces revealed no significant differences in mean F_R among these three conditions (Fig. 5C). The similarity in mean F_R with and without LIBS-6 indicates that in our system, $\alpha_v\beta_3$ -RGD rupture forces do not detectably increase when the integrin is activated.

We also measured the $\alpha_v\beta_3$ -RGD specific binding frequency f_b . Mean f_b at pH 7.4 increased after incubation with LIBS-6, demonstrating that a shift towards the activated state in the $\alpha_v\beta_3$ conformational equilibrium can be detected on intact cell surfaces as an increase in specific binding frequency. This is due to the much higher likelihood of the extended integrin conformations, as compared to the bent conformations, to bind the adhesive ligands.

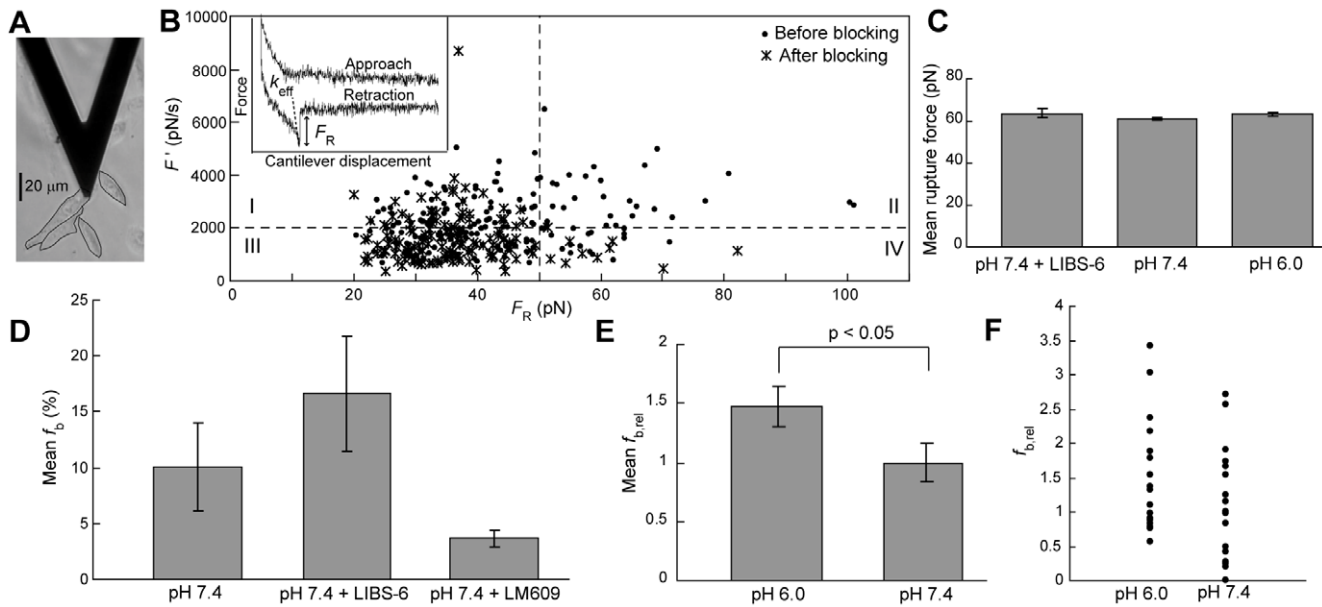


Figure 5. AFM-mediated molecular force spectroscopy measurements demonstrate that acidic extracellular pH increases frequency of $\alpha_v\beta_3$ -RGD binding on live cell surfaces, but does not alter rupture forces. (A) Optical image of an AFM cantilever positioned over an $\alpha_v\beta_3$ CHO-B2 cell. (B) Rupture forces F_R and effective loading rates F' for all unbinding events measured before and after LM609 blocking in a single experiment. Inset depicts a representative force-displacement curve. (C) Mean rupture forces measured at pH 7.4, pH 7.4 after $\alpha_v\beta_3$ activation by LIBS-6, and pH 6.0. (D) Mean specific binding frequencies f_b at pH 7.4 before and after $\alpha_v\beta_3$ activation by LIBS-6 or $\alpha_v\beta_3$ blocking by LM609. (E) Mean relative specific binding frequencies $f_{b,rel}$ at pH 6.0 and pH 7.4. (F) Single cell relative binding frequencies $f_{b,rel}$ (one point per cell) used to calculate the average in (E). All error bars represent SEM. doi:10.1371/journal.pone.0015746.g005

Mean f_b was very low after blocking with LM609, confirming the specificity of the interactions chosen for analysis (Fig. 5D).

We then normalized single-cell f_b values to the mean f_b measured at pH 7.4, to obtain the relative specific binding frequency $f_{b,rel}$; this normalization enabled us to combine data from replicate experiments conducted with different cantilevers. Comparison of $f_{b,rel}$ at pH 6.0 and pH 7.4 revealed that the mean $f_{b,rel}$ was significantly higher at pH 6.0 ($p < 0.05$, Fig. 5E), although there was considerable variation in $f_{b,rel}$ among different cells within a given pH (Fig. 5F). This trend was maintained in each of the three independent experiments we conducted. The shift in mean $f_{b,rel}$ cannot be explained by a change in the cell surface expression level of $\alpha_v\beta_3$, as demonstrated by our flow cytometry results with antibody LM609 (Fig. 4C). In combination with the observation that binding frequency increases after activation by LIBS-6, these experimental data indicate that acidic extracellular pH shifts the $\alpha_v\beta_3$ conformational equilibrium towards the activated state.

Acidic extracellular pH influences cell spreading, morphology, and migration speed

We next examined the effect of acidic extracellular pH on cell-level adhesion and migration. We first considered the dynamic cell response to pH changes by utilizing the media bicarbonate buffer to create a system in which pH varied over time. For these experiments, $\alpha_v\beta_3$ CHO-B2 cells were seeded on fibronectin-coated glass-bottom dishes and allowed to adhere for 3 hours. Media pH was then changed to pH 6.0 every hour for 8 hours; between pH changes, the media pH increased from 6.0 up to ~ 7.2 due to the bicarbonate buffer and the presence of 5% CO_2 . This pH increase was clearly visible as a change in color of the pH indicator present in the media (Fig. 6A colorbar). Each time the media was changed to pH 6.0, many cells responded within

minutes by spreading and elongating. This caused the projected cell area to increase, reaching a maximum about 30 minutes after each induced acidification to pH 6.0 (Fig. 6A). As the media pH increased toward neutral pH, cells eventually began to shrink and thus the projected cell area decreased. This cell behavior was consistent and repeatable over 8 hours of media pH changes, resulting in oscillations of measured cell area that initiated within minutes. Consistent with these measurements of changes to cell morphology in the attached state, we also observed that the initial adhesion and spreading of cells seeded from the suspended state also varied with pH: cells exhibited a higher spread area 30 minutes after adhesion when seeded in acidic media, as compared to media at pH 7.4 (Fig. S2). To further explore cell spreading as a function of pH, we quantified membrane dynamics via kymography [40]. Analysis of kymographs showed that membrane protrusion velocity was decreased and protrusion lifetime was increased at acidic pH, as compared to pH 7.4 (Figure S3).

To measure the effects of acidic pH over longer timescales, we seeded $\alpha_v\beta_3$ CHO-B2 cells on fibronectin-coated polystyrene dishes and allowed them to adhere for 3 hours before changing the media to pH 6.5 or 7.4. Media pH was then maintained over eight hours by using dishes with tight-fitting lids that eliminated air exchange and consequent bicarbonate buffer-mediated pH changes. Eight hours after the pH change, many cells at pH 6.5 had developed an elongated morphology (Fig. 6B images). This was quantified by calculating cell circularity, which ranges from 0–1. Circularity close to 1 indicates that the cell has a rounded morphology, while circularity close to 0 indicates an elongated or dendritic morphology. Consistent with observations from such images, the mean cell circularity was significantly lower at 6.5 than at pH 7.4 (Fig. 6B). When integrin $\alpha_v\beta_3$ was blocked with soluble RGD peptides, mean cell circularity was high and the pH-dependent difference was eliminated. The same effect was

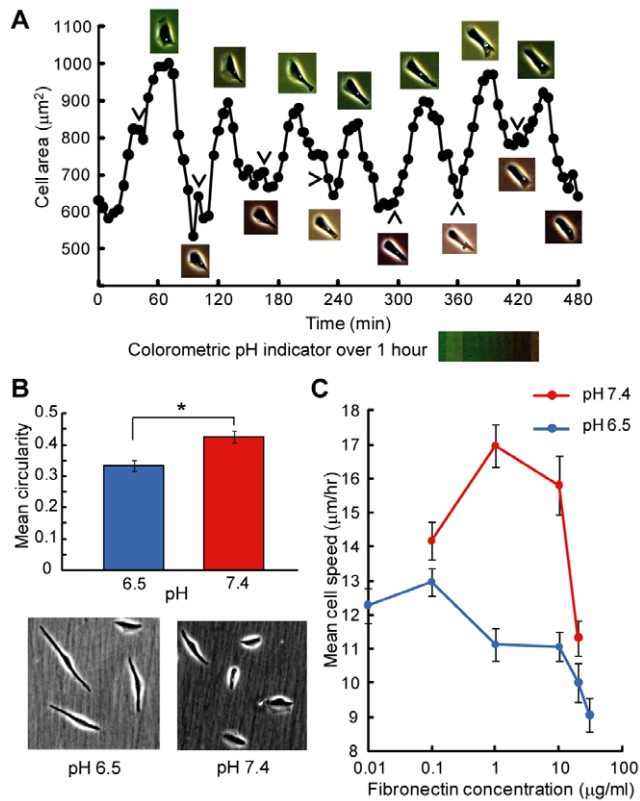


Figure 6. Cell spreading, morphology, and migration speed are altered at acidic extracellular pH. (A) Cell area for a representative cell over 8 hours, during which media pH was changed to pH 6.0 every hour. After each pH change, media pH drifted up to ~ 7.2 due to presence of bicarbonate buffer, as evidenced by the color change of the pH indicator in the media (shown for 1 hour). Images are snapshots of the cell at area minima and maxima. Arrowheads indicate point immediately before media pH was brought down to pH 6.0. Each hour, cell area increased immediately after pH was dropped to 6.0, and decreased as pH drifted up. (B) Mean cell circularity 8 hours after changing media pH for adhered $\alpha_v\beta_3$ CHO-B2 cells. Cell circularity was significantly lower at pH 6.5 than at pH 7.4 (asterisk indicates $p=0.0002$). Images are representative for cells at pH 6.5 and pH 7.4. (C) Mean cell migration speed as a function of fibronectin coating concentration. Maximum migration speed occurred at a lower fibronectin concentration when cells were in acidic pH. Statistical significance of maximum migration speed value at pH 7.4: 0.1 vs. 1 $\mu\text{g/ml}$, $p<0.05$; 1 vs. 20 $\mu\text{g/ml}$, $p<0.001$; 1 vs. 30 $\mu\text{g/ml}$, $p<0.001$. For pH 6.5: 0.1 vs. 1 $\mu\text{g/ml}$, $p<0.1$; 0.1 vs. 10 $\mu\text{g/ml}$, $p<0.05$; 0.1 vs. 20 $\mu\text{g/ml}$, $p<0.001$; 0.1 vs. 30 $\mu\text{g/ml}$, $p<0.001$. All error bars represent SEM. doi:10.1371/journal.pone.0015746.g006

observed for CHO-B2 pCDNA cells. When integrin $\alpha_v\beta_3$ was activated with Mn^{2+} ions, mean cell circularity was low, and the pH-dependent difference was again eliminated (Fig. S4).

We also measured cell migration speed as a function of fibronectin coating concentration at pH 6.5 and pH 7.4. Cell migration speed is expected to be biphasic with respect to ligand density [41]; at low ligand densities, the cell is unable to gain sufficient traction for migration, while at higher than optimal ligand densities, migration is limited by the ability of the cell trailing edge to detach from the substratum [42]. Modulating cell-substratum adhesiveness by changing integrin expression level or activation state alters the ligand density required for maximum migration speed [43]. Our cell migration experiments were conducted for $\alpha_v\beta_3$ CHO-B2 cells seeded on fibronectin-coated polystyrene dishes with tight-fitting lids to maintain media pH. For

cells in media maintained at pH 7.4, peak migration speed occurred at 1 $\mu\text{g/ml}$ fibronectin, compared to a peak migration speed at 0.1 $\mu\text{g/ml}$ fibronectin for cells in pH 6.5 media (Fig. 6C). Although the maximum measured speed value was lower at pH 6.5 than at pH 7.4, this leftward shift of peak speed to lower fibronectin concentrations indicates that cells at acidic pH require less ligand to achieve an optimal balance between traction and detachment. We note that the ligand density required for peak migration speed was substrate dependent, and occurred at higher fibronectin concentrations for cells plated on fibronectin-functionalized glass (Fig. S5).

Discussion

We have used MD simulations, flow cytometry experiments, AFM force spectroscopy, and cell-level morphology and migration experiments to assess the effect of acidic extracellular pH on integrin $\alpha_v\beta_3$ conformation and $\alpha_v\beta_3$ CHO-B2 cell behavior. MD simulations demonstrate that the $\alpha_v\beta_3$ headpiece attains a partially open state more frequently at acidic pH than at normal physiological pH, possibly due to ASP β 127 protonation and the resulting loss of ASP β 127-ADMIDAS ion coordination (Figs. 2–3). Several previous experimental studies have been reported in which ASP β 127 in β_3 or the equivalent residue in other β subunits was mutated to ALA, which results in loss of ADMIDAS ion coordination. Overall, previous results of this mutation with respect to different integrin conformations and binding capacities are inconsistent, varying with the beta subunit. Mutated $\alpha_2\beta_1$ and $\alpha_5\beta_1$ integrins are capable of binding, mainly exhibit a closed headpiece, and can be activated by antibodies [2,44]. Mutated integrin $\alpha_1\beta_2$ showed constitutive ligand binding, but remained in the bent conformation [45]. However, ASP β 127 mutation in $\alpha_{11b}\beta_3$ does not inhibit normal activation and binding [46]. Therefore, losing ASP β 127-ADMIDAS ion coordination in β_3 does not necessarily impair integrin function. Furthermore, ALA substitution of the ASP β 127-equivalent residue in $\alpha_4\beta_7$ resulted in constitutive activation [3]. This suggests that in some integrins, loss of coordination of the ASP β 127-equivalent residue to the ADMIDAS ion is sufficient to cause integrin activation. Protonation of this residue at acidic extracellular pH is one mechanism by which loss of ADMIDAS ion coordination can occur. Although ALA mutation studies complement our MD simulation findings, we note that protonated ASP can participate in side-chain hydrogen bonding, but ALA cannot.

Our flow cytometry results indicate an increased number of activated $\alpha_v\beta_3$ integrins on live cell surfaces after exposure to pH 6.0 (Fig. 4). It is important to note that in our assay it was necessary to perform the antibody-labeling step at pH 7.4 to ensure maximal antibody binding. Our data at pH 6.0 indicate that the activated integrin conformation can persist to some extent after cells are returned to pH 7.4. This is consistent with the results of Tzima et al., which demonstrated that even after removal of an activating stimulus, $\alpha_v\beta_3$ integrins stay activated long enough to be labeled with WOW-1 antibody fragment Fab (i.e., ~ 30 min post-activating stimulus) [47]. However, the levels of activated $\alpha_v\beta_3$ we measured after exposure to pH 6.5 and pH 7.0 were not higher than that at pH 7.4, indicating that some level of reversal in activation state does occur after cells are returned to pH 7.4. Accordingly, it is plausible that acid-induced integrin activation also initially occurred in the pH 6.5 and 7.0 conditions, though to not as great a magnitude as for pH 6.0, so that detection in this assay was obfuscated during the antibody binding step.

Our AFM force spectroscopy results further demonstrate that the specific binding frequency of $\alpha_v\beta_3$ integrins on cell surfaces to

the RGD ligand increases at acidic pH, indicating an increase in the number of activated integrins (Fig. 5). However, the mean rupture forces measured at pH 7.4 and pH 6.0 are very similar to that measured after $\alpha_v\beta_3$ activation by LIBS-6. We can speculate on a number of reasons underlying our observation that mean F_R did not increase upon activation. First, integrins are conformationally dynamic, and rearrange to the high-affinity state upon ligand binding [5]. Therefore, if RGD bound to a bent-closed or extended-closed integrin, the receptor may have rearranged to the extended-open conformation during our experimental contact time (>100 ms). Second, the bent-closed (low-affinity) conformation displays very low binding in other assays [5,6,7], so this conformation might not have been sampled substantively in our experiments. Finally, if RGD bound to a bent-closed or extended-closed integrin, and the receptor did not change conformation before unbinding, it is probable that the resulting rupture forces would be less than 50 pN and would not be distinguishable from nonspecific interactions in our analysis. Therefore, although the RGD ligand theoretically could have bound to any of the three integrin conformations, the measured mean specific F_R would not necessarily reflect a shift in the conformational equilibrium. In contrast to our results, previous AFM force spectroscopy studies by Li et al. and Zhang et al. report that integrin activation increased the measured F_R for $\alpha_5\beta_1$ -fibronectin [38] and $\alpha_4\beta_1$ -VCAM-1 [37]. It is possible that there were fewer nonspecific interactions in those experiments, or that the rate of conformational switching is slower for the integrins they probed, enabling measurement of ligand unbinding from the low-affinity integrin conformation. We also note that Lehenkari and Horton reported an increase in $\alpha_v\beta_3$ -RGD F_R at acidic pH [30]. Although that early observation supports our conclusion that acidic pH promotes integrin activation, those results should be interpreted with caution. For example, in those experiments, the RGD peptides were noncovalently functionalized to the AFM cantilevers, which can result in detachment of RGD from the AFM probe during the repeated interactions with the cell surface and render it difficult to ensure specificity of measured rupture forces.

Our combined MD, flow cytometry, and AFM force spectroscopy data suggest a novel model by which acidic pH promotes headpiece opening of integrin $\alpha_v\beta_3$ via protonation of ASP β 127. This could occur for integrins in the bent-closed or extended-closed conformation. The open headpiece destabilizes the bent conformation; therefore, acidic pH has the overall effect of shifting the integrin conformational equilibrium towards the high affinity extended-open state (Fig. 7). Conformational regulation by extracellular pH is a previously undescribed mechanism of integrin activation.

This model of pH-induced integrin activation is consistent with our cell-level measurements of cell area, circularity, and migration speed. Increased cell-substratum adhesiveness due to increased integrin activation should result in greater cell spreading, which is in agreement with our observation of oscillations in projected cell area in response to media pH changes (Fig. 6A). The dynamic, rapid, and reversible cell response to acidic pH indicates that this effect is not mediated by internal cell processes such as changes in protein expression, which would take longer to manifest, but is consistent with our biophysical model of pH-altered adhesiveness at the cell-substratum interface. Furthermore, the increase in cell area is not due to an increase in actin polymerization rate, as demonstrated by our kymography experiments that showed lamellipodial protrusion velocity to decrease in acidic pH (Fig. S3). In addition, protrusion lifetime increased in acidic pH, indicating enhanced lamellipodial stability, which is consistent with increased cell-substratum adhesiveness in this condition [40].

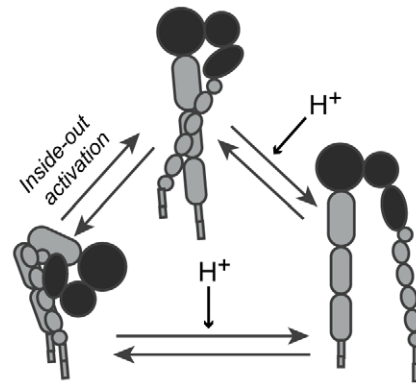


Figure 7. Model of pH-regulated integrin activation. Inside-out activation mechanisms can cause the bent-closed conformation to convert to the extended-closed conformation. Acidic extracellular pH can then promote headpiece opening to the extended-open conformation. In addition, acidic pH can stimulate headpiece opening on the bent-closed integrin, which is expected to lead to extension of the integrin legs. Through these dual mechanisms, acidic extracellular pH can shift the integrin conformational equilibrium to the high affinity extended-open state.

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For our measurements of cell circularity and migration speed, the media was maintained at a steady acidic pH level over several hours. These experiments were conducted at pH 6.5 rather than pH 6.0. Although pH 6.0 is appropriate for experiments measuring molecular-level integrin activation and binding to antibodies or ligands, it may be too acidic for complex cell-level processes such as migration, which involve many subcellular systems that could be independently and deleteriously affected by acidic pH. Our MD data indicate that the critical amino acid ASP β 127 will be protonated on the majority of integrins as long as the extracellular pH is less than the predicted pKa of this residue within the integrin (6.692); therefore, we chose pH 6.5 for these long-timescale cell-level experiments.

Our observation that cells attained an elongated morphology characterized by lower circularity after long-timescale exposure to pH 6.5 (Fig. 6B) is consistent with Stock et al.'s observation of lower melanoma cell circularity in acidic pH [24]. Further, we demonstrate that activation of integrin $\alpha_v\beta_3$ with Mn^{2+} ions resulted in pH-independent low cell circularity (Fig. S4), which is consistent with Smith et al.'s observation that antibody-induced integrin activation caused T cells to adopt an elongated morphology [48]. These data indicate that the elongated morphology observed in our experiments can be attributed to increased integrin activation caused by acidic extracellular pH. We note that our model of acid-induced integrin activation is also consistent with Stock et al.'s speculation that acidic pH strengthened the integrin-ligand bond in their studies of melanoma cell morphology and migration [24]. Furthermore, our prediction that acidic pH could increase cell-substratum adhesiveness is consistent with several other reported effects of acidic pH on cell behavior, such as longer filopodia [27], increased adhesion efficiency [29], and increased cell spreading [26].

Our cell migration experiments demonstrated that the fibronectin concentration required for maximum migration speed is decreased at acidic pH (Fig. 6C). Palecek et al. showed that antibody-induced integrin activation in $\alpha_{IIb}\beta_3$ CHO cells also decreased this critical ligand concentration to a similar extent as observed in our experiments [43]. Therefore, our measurement of a leftward shift of peak migration speed can be explained by a

model of increased integrin activation at acidic pH, which results in increased cell-substratum adhesiveness and consequently less ligand required for efficient migration. However, in our experiments, we also observed that the maximum cell speed measured at pH 6.5 was lower than the maximum speed measured at pH 7.4. Such an effect was not observed in the studies by Palecek et al. [43], indicating that the reduction in peak migration speed we observed at acidic pH cannot be explained by increased integrin activation alone. Indeed, we speculate that this effect may be due in part to the decreased lamellipodial protrusion velocity we observed at acidic pH (Figure S3). Although this indicates that acidic pH may affect complex cell behaviors such as migration via more than one mechanism, it does not preclude the possibility of integrin activation via extracellular acidification. Finally, we note that it is unlikely that any of our cell-level results can be explained by acid-induced changes to fibronectin, as both guanidine hydrochloride-induced denaturation experiments and computational electrostatic calculations have demonstrated that the fibronectin protein structure is generally unchanged for pH 6.0 and higher [49,50].

It is possible that our experimental changes to extracellular pH concurrently changed intracellular pH and associated cellular signaling events [51]. However, it is unlikely that our collective observations of increased integrin activation are due solely to alterations in intracellular signaling. First, our cell-free molecular dynamics simulations show that acidic extracellular pH causes opening of the integrin $\alpha_v\beta_3$ headpiece in the absence of the transmembrane and intracellular domains, and in the absence of other intracellular proteins. Furthermore, our cell-level results are in agreement with those of Stock et al., who found that changes in intracellular pH could not explain their observed changes to cell morphology and migration [24]. While it remains possible that intracellular pH-induced changes to talin or other molecules may be a complementary mechanism of pH-induced integrin regulation, this does not exclude the possibility of direct extracellular pH-mediated integrin activation.

Acid-induced integrin activation poses interesting implications for cell adhesion and migration in several physiologically relevant contexts. In the tumor environment, the extracellular pH is generally acidic at the tumor periphery and is expected to increase in a gradient to physiological pH 7.4 away from the tumor site. Cells seeded on fibronectin gradients preferentially migrate towards areas of higher fibronectin concentration with concurrently higher overall adhesiveness [52]. Our prediction that regions of more acidic pH also confer higher effective adhesiveness suggests that the pH gradient in the tumor environment may alter migration dynamics of vascular endothelial cells or primary tumor cells in the near tumor site, providing an intriguing opportunity for further study. Further, the acidic pH in the early stages of wound healing could promote adhesion of inflammatory cells or directional migration of fibroblasts into the wound site. Finally, our results are also relevant to migration of normal healthy cells, even when bulk pH is ~ 7.4 . Due to the localization of the ion exchanger NHE1, the extracellular environment at the leading edge of polarized cells is more acidic than that at the trailing edge [21,22]. Therefore, according to our proposed model, integrins will be activated in greater numbers at the leading edge, resulting in stronger adhesion. This will enhance the asymmetry in adhesiveness that is necessary for efficient migration [41,53].

Integrin activation can be regulated by chemomechanical factors as diverse as divalent cation concentration [5,10,11], intracellular signaling [6,8], and fluid shear stress [47]. Our computational and experimental findings demonstrate that integrin activation and binding affinity can also be modulated

directly by the pH of the extracellular microenvironment. Together, these disparate activation mechanisms may enable integrins to finely tune binding affinity in response to intra- and extracellular cues, thereby facilitating precise regulation of cell adhesion and migration in varied environments. Elucidation of the ways in which various integrin activation mechanisms are coordinated will contribute to the challenging and exciting goal of understanding and modulating cell adhesion and migration in diverse physiological and pathological microenvironments.

Materials and Methods

Antibodies and reagents

Antibody LM609 was purchased from Millipore and Alexa 488 goat anti-mouse IgG (H+L) F(ab')₂ fragment was purchased from Invitrogen. WOW-1 Fab and LIBS-6 antibodies were provided by Dr. Sanford Shattil and Dr. Mark Ginsberg, respectively. SH-PEG-NH₂ linker was purchased from Nanocs and Sulfo-LC-SPDP was purchased from Pierce Biotechnology. Dulbecco's Modified Eagle Medium (DMEM), antibiotics-antimycotics, non-essential amino acids, and zeocin were purchased from Invitrogen. Fibronectin from human plasma was purchased from Sigma. Fetal bovine serum was purchased from Hyclone.

Cell culture

$\alpha_v\beta_3$ CHO-B2 cells and CHO-B2 pCDNA cells were provided by Dr. Linda Griffith (Massachusetts Institute of Technology), as subcultures of cell lines developed by Dr. Jean Schwarzbauer (Princeton University) and Dr. Siobhan Corbett (University of Medicine and Dentistry of New Jersey), respectively. Cell culture media consisted of high-glucose bicarbonate-buffered DMEM containing L-glutamine and sodium pyruvate, supplemented with 10% fetal bovine serum, 1% antibiotics-antimycotics, and 1% non-essential amino acids. Media also included 500 $\mu\text{g}/\text{mL}$ zeocin or 250 $\mu\text{g}/\text{mL}$ G418 for $\alpha_v\beta_3$ CHO-B2 or CHO-B2 pCDNA cells, respectively. Cells were maintained in an incubator at 37°C with 5% CO₂.

Molecular dynamics simulations

The input crystal structure for MD simulations was the extracellular portion of integrin $\alpha_v\beta_3$ in complex with an RGD ligand (PDB ID 1L5G [9]). Mn²⁺ ions were replaced with Mg²⁺, and only the α propeller, β hybrid, and βA domains were simulated. Molecular dynamics simulations were conducted using GROMACS version 3.3 [54]. Simulations were performed under constant pressure and temperature, using periodic boundary conditions and Particle Mesh Ewald electrostatics with a short range interaction cutoff of 0.9 nm. The PRODRG server [55] was used to generate the RGD ligand topology. Multi-Conformation Continuum Electrostatics [31,32] was used to predict pKa values for all the titratable amino acid residues in the integrin-ligand system. To simulate an effective acidic pH, all residues with pKa > 6.2 were protonated. To simulate the normal physiological pH of ~ 7.4 , all residues with pKa > 8.4 were protonated. GLU β 400 and GLU β 409 were not protonated in spite of their elevated pKa values; this is because these residues are close to the C-terminus of the simulation system and are thus artificially solvent exposed. A third simulation system designed to test the role of ASP β 127 had this residue protonated, in addition to all residues with pKa > 8.4.

After protonation, the protein was solvated with Simple Point Charge water molecules in a box of dimensions 10.235 nm \times 11.513 nm \times 8.298 nm. Na⁺ and Cl⁻ were added at a physiological concentration of 0.137 M to provide charge

neutrality. For each pH system, a two step steepest descents minimization of the X-ray diffraction structure was performed. In the first step, the integrin, RGD, and Mg^{2+} ions were held fixed and the maximum force in the system was reduced to less than $2000 \text{ kJ mol}^{-1}\text{nm}^{-1}$. In the second step, the full system was free to move and the maximum force in the system was reduced to less than $1500 \text{ kJ mol}^{-1}\text{nm}^{-1}$. After minimization, a 10 ps molecular dynamics simulation was performed with position restraints on the side chains of ARG_{RGD} and ASP α 218, as suggested by Puklin-Faucher et al. [33]. Eight simulations of 10 ps duration were conducted for each pH, each with a different seed for random initialization of atomic velocities. The final frame at 10 ps was taken as input for further simulation, resulting in eight different input configurations for each pH. An MD simulation of 8 ns duration was performed for each input configuration. During MD simulations, ARG_{RGD} and ASP α 218 position restraints were removed, and center of mass rotation and translation of the receptor were restrained.

To quantify the headpiece opening that occurred during MD simulations, we calculated the y-component of the distance d between a portion of the β -propeller domain (residues α 250–438) and a portion of the hybrid domain (residues β 55–106 and β 356–434, Fig. 2A–B). The centers of mass of these regions were used for the distance calculation, and d was calculated at every recorded frame (every 5 ps) of each MD trajectory.

Flow cytometry

Flow cytometry experiments were performed with $\alpha_v\beta_3$ CHO-B2 cells, which have been engineered to express the integrin β_3 subunit; the parental cell line CHO-B2 does not bind RGD [56]. CHO-B2 pCDNA cells were used as a negative control. WOW-1 Fab was used as a primary antibody to label activated $\alpha_v\beta_3$, and LM609 was used to label all conformations of $\alpha_v\beta_3$. Alexa 488 goat anti-mouse IgG (H+L) F(ab')₂ fragment was used as the secondary antibody.

The buffer used for all flow cytometry experiments consisted of 137 mM NaCl, 2.7 mM KCl, 3.3 mM NaH_2PO_4 , 3.8 mM HEPES, 5.5 mM glucose, 1 mg/ml BSA, and 0.75 mM divalent cations (CaCl_2 , MgCl_2 , or MnCl_2 , as noted). Buffer was adjusted to desired pH using HCl and NaOH. Experiments were conducted at pH 6.0, 6.5, 7.0, 7.4, and 8.0. Cells were prepared for flow cytometry analysis as follows: cells were washed with (Ca^{2+} , Mg^{2+} -free) PBS, and detached with trypsin/EDTA. Trypsin was diluted, and cells were centrifuged at 800 rpm for 5 minutes. Cells were resuspended in buffer at desired pH, and 10 μl of each cell type was removed for counting in a hemocytometer. Cells were then centrifuged and resuspended at desired pH at a concentration of 2.3566×10^6 cells/ml and incubated at room temperature for 20 minutes. All following steps were performed with pH 7.4 buffer. Cells were centrifuged and resuspended at 13.158×10^6 cells/ml or 5×10^6 cells/ml for WOW-1 Fab and LM609 experiments, respectively. 0.5×10^6 cells were incubated with 12 μl WOW-1 Fab or 2 μg LM609 for 30 minutes at room temperature or on ice, respectively. During antibody incubations, cells were agitated every 10 minutes. After incubation, 200 μl buffer was added and cells were centrifuged. Cells were then resuspended in 100 μl buffer, and 100 μl of secondary antibody solution (1:300 dilution in PBS) was added. Cells were incubated in secondary antibody for 30 minutes on ice, and agitated every 10 minutes. After incubation, 200 μl of buffer was added and cells were centrifuged. Cells were resuspended in 0.5 ml buffer and analyzed on a BD FACSCalibur flow cytometer. All experiments were performed with triplicate samples, and at least two independent experiments were performed for each pH (pH 6.0,

N = 2; pH 6.5, N = 2; pH 7.0, N = 3; pH 7.4, N = 6; pH 8.0, N = 2). For each experiment, the average $\alpha_v\beta_3$ CHO-B2 geometric mean fluorescence intensity (MFI) was normalized to the average CHO-B2 pCDNA geometric MFI. This quantity is referred to as the normalized geometric MFI.

AFM force spectroscopy

All AFM force spectroscopy measurements were performed on an MFP-3D (Asylum Research, Inc.) system using Olympus TR400PB gold-coated silicon nitride cantilevers, with spring constant $k \sim 25 \text{ pN/nm}$. Cantilever spring constant varied by approximately $\pm 10\%$ from this value. Cantilevers were cleaned in piranha solution (70% sulfuric acid, 30% hydrogen peroxide) and then rinsed thoroughly with 18 M Ω Millipore water. Rinses in following steps were performed in PBS+1 mM EDTA. To conjugate a polyethylene glycol (PEG) linker to the cantilever surface, a 1 mM solution of SH-PEG-NH₂ (3.4 kDa) in PBS-EDTA was allowed to react with cantilevers for one hour at room temperature. Cantilevers were rinsed and then allowed to react with a solution of Sulfo-LC-SPDP cross-linker for 30 minutes at room temperature. Solution was prepared by dissolving Sulfo-LC-SPDP in ultrapure water at 20 mM, and diluting this solution 1:40 in PBS-EDTA. Cantilevers were rinsed and then incubated in a 1 mg/ml solution of GRGDSPC peptide overnight at room temperature. Cantilevers were rinsed thoroughly once again to remove excess peptide before use. Functionalization was confirmed using fluorescent GRGDSPC peptides.

Experiments were performed at room temperature in buffer containing 137 mM NaCl, 2.7 mM KCl, 3.3 mM NaH_2PO_4 , 3.8 mM HEPES, and 1 mM MgCl_2 . Buffer was adjusted to pH 7.4 or pH 6.0 using HCl and NaOH. Experiments were conducted on $\alpha_v\beta_3$ CHO-B2 cells adhered to 60 mm-diameter tissue-culture treated polystyrene Petri dishes (Falcon). Cells were incubated at room temperature for 20–30 minutes before measurements were taken. In experiments with LIBS-6 and LM609, antibody was added at 25 $\mu\text{g/ml}$ or 20 $\mu\text{g/ml}$ respectively, and allowed to react for 30 minutes at room temperature. For each cell, 200 force cycles were conducted in a 10×20 grid on a $2 \times 2 \mu\text{m}$ area. For each force cycle, the AFM cantilever was positioned above a cell away from the nucleus. Cantilevers were moved toward the cell at a velocity $v = 5 \mu\text{m/s}$ until a trigger force of 150 pN was reached. Cantilevers were then held on the cell surface for 0.1 s before retraction at $5 \mu\text{m/s}$. All unbinding measurements were conducted at the same applied loading rate. Cantilevers were held above the cell surface for 1 s to allow cells to recover between measurements. Unbinding events were detected as jumps in the retraction portion of the force-displacement data.

Output force-displacement (F - d) data were analyzed with a customized Matlab script. For every F - d response exhibiting a visible unbinding event (jump in force during retraction), rupture force F_R was calculated as the difference between the average force following rupture and the minimum point at rupture. Effective loading rate F' was calculated as the product of the slope immediately before rupture (k_{eff}) and the cantilever velocity v (Fig. 5B inset). Unbinding events with $F_R > 50 \text{ pN}$ and $F' > 2000 \text{ pN/s}$ were taken to be specific $\alpha_v\beta_3$ -RGD interactions (Fig. 5B). Single-cell specific binding frequency f_b was calculated as the number of specific unbinding events on a given cell normalized to the total number of unbinding events observed on that cell. Single-cell relative specific binding frequency $f_{b,\text{rel}}$ was calculated as the single-cell f_b normalized to the average f_b value at pH 7.4. Mean f_b and $f_{b,\text{rel}}$ are averages taken over several cells at each condition. Three independent experiments comparing pH condi-

tions were performed, with each replicate experiment at each pH including 200 spectra on each of five cells.

Cell morphology and migration experiments

Unless otherwise noted, media for cell experiments consisted of high-glucose bicarbonate-buffered DMEM containing L-glutamine and sodium pyruvate, supplemented with 1% antibiotics-antimycotics, 1% non-essential amino acids, and 500 $\mu\text{g}/\text{mL}$ zeocin. For migration experiments, 50 mm-diameter Petri dishes with tight-fitting lids (Pall Life Sciences) were coated with 0.1–30 $\mu\text{g}/\text{mL}$ fibronectin in PBS for 1 hour at room temperature. Dishes were then rinsed twice with PBS. $\alpha_v\beta_3$ CHO-B2 cells were plated on dishes in serum-free media at a density of approximately 6000 cells/ cm^2 and allowed to adhere for 3 hours before media was changed to pH 6.5 or 7.4. After media pH change, Petri dish lids were tightened to eliminate air exchange and consequent pH drift. Cells were imaged in phase contrast every 5 minutes for 8 hours in an incubator at 37°C. 10–15 unique fields were imaged for each experiment. Cell centroids were tracked using ImageJ, and cells that divided or touched other cells were excluded from analysis. Mean-squared displacements as a function of time ($\langle d^2(t) \rangle$) were calculated using the method of non-overlapping intervals [57,58]. The root mean-squared displacement for the shortest interval was divided by the interval time (5 minutes) to obtain cell speed S . Mean-squared displacements as a function of time were fit to a persistent random walk model: $\langle d^2(t) \rangle = 2S^2P[t - P(1 - e^{-t/P})]$ [57]. Cells with a goodness-of-fit $R^2 < 0.5$ were not included in the calculation of mean cell speed. At least 40 cells with $R^2 > 0.5$ were analyzed for each condition. Cells plated on 10, 20, and 30 $\mu\text{g}/\text{mL}$ fibronectin were also analyzed to measure circularity ($4\pi A/P^2$, where A is the projected cell area and P is the cell perimeter) at the 8-hour timepoint. Experiments at different fibronectin concentrations showed consistent results; presented data correspond to the fibronectin concentration of 10 $\mu\text{g}/\text{mL}$.

For pH oscillation experiment, 60 mm-diameter glass-bottom Petri dishes (MatTek) were coated with 30 $\mu\text{g}/\text{mL}$ fibronectin as described above. $\alpha_v\beta_3$ CHO-B2 cells were plated on dishes in serum-free media at a density of approximately 6000 cells/ cm^2 and allowed to adhere for 3 hours. After 3 hours, media was changed to pH 6.0 and refreshed to pH 6.0 every hour; between media changes, pH increased to ~ 7.2 . Cells were imaged in phase contrast every 5 minutes for 8 hours in an incubator at 37°C with 5% CO_2 . Projected cell area was measured using ImageJ. An independent experiment with 10 $\mu\text{g}/\text{mL}$ fibronectin coating showed similar cell area oscillations (data not shown).

Statistical Analysis

For comparison of two conditions, p values were calculated with an unpaired t-test. For comparison of three or more conditions, p values were calculated with a Bonferroni post-test following one-way ANOVA.

Supporting Information

Figure S1 Representative flow cytometry fluorescence intensity histograms illustrating WOW-1 Fab binding for CHO-B2 pCDNA cells, which do not express the integrin β_3 subunit, and $\alpha_v\beta_3$ CHO-B2 cells exposed to Mn^{2+} , which activates integrin $\alpha_v\beta_3$.

(TIF)

Figure S2 Mean spread area of $\alpha_v\beta_3$ CHO-B2 cells plated from the suspended state into media at pH 6.0 or

pH 7.4. No. 1 glass coverslips or glass-bottom P60 dishes (MatTek) were coated with 15 $\mu\text{g}/\text{mL}$ fibronectin in PBS for 1 hour at room temperature. Coverslips or dishes were then rinsed with PBS. $\alpha_v\beta_3$ CHO-B2 cells were plated on coverslips or dishes in serum-free media with an initial pH of 6.0 or 7.4 and allowed to adhere for 30 minutes in an incubator at 37°C with 5% CO_2 before imaging in phase contrast. Media initially set to pH 6.0 remained below pH 7.0 for the duration of the incubation. Cell area was measured using ImageJ. Two independent experiments were performed: in each experiment, approximately 40 cells were measured for each pH. Independent experiments showed consistent results, and data presented are from a single experiment. Results demonstrate that the mean cell area was significantly higher at pH 6.0 than at pH 7.4 ($p = 0.0249$). Error bars represent SEM.

(TIF)

Figure S3 Kymography experiments demonstrate that membrane protrusion lifetime increases and protrusion velocity decreases at acidic extracellular pH.

(A) Example kymograph illustrating $\alpha_v\beta_3$ CHO-B2 membrane dynamics. (B) Mean protrusion lifetime for cells in pH 6.5 or pH 7.4. (C) Mean protrusion velocity for cells in pH 6.5 or pH 7.4. Experiments were conducted as follows: glass-bottom P60 dishes (MatTek) were coated with 30 $\mu\text{g}/\text{mL}$ fibronectin in PBS for 1 hour at room temperature. Dishes were then rinsed with PBS. $\alpha_v\beta_3$ CHO-B2 cells were plated on coverslips or dishes in serum-free media and allowed to adhere for 3 hours before media was changed to bicarbonate-free serum-free media at pH 6.5 or 7.4. Cells were imaged in phase contrast at 40 \times magnification. Images were collected every 5 seconds for a duration of 25 minutes. Each kymograph was produced by drawing a one-pixel-wide line perpendicular to the cell membrane at an active lamellipod. The images along this line at all timepoints were then sequentially compiled into a single image, illustrating the membrane dynamics at that specific location on the cell. For each visible protrusion event on a kymograph, a straight line was drawn from the beginning of the event to its peak, or to the beginning of a plateau. Events with a height of less than 4 pixels were neglected. The slope of this line represents the protrusion velocity. Protrusion lifetime was quantified as the x-axis projection of this line, with the addition of plateau duration, if applicable. Two independent experiments were conducted: in each experiment, approximately 10–20 cells were imaged and 300–400 protrusion events were analyzed for each pH condition. Independent experiments showed consistent results, and data presented are from a single experiment. Results demonstrate that protrusion velocity is significantly decreased and protrusion lifetime is significantly increased at acidic pH (asterisks represent $p < 0.001$). Error bars represent SEM.

(TIF)

Figure S4 Mean cell circularity 8 hours after changing media pH for adhered $\alpha_v\beta_3$ CHO-B2 cells or CHO-B2 pCDNA cells.

Petri dishes of 50 mm diameter with tight-fitting lids (Pall Life Sciences) were coated with 10 $\mu\text{g}/\text{mL}$ fibronectin in PBS for 1 hour at room temperature. Dishes were then rinsed twice with PBS. $\alpha_v\beta_3$ CHO-B2 or CHO-B2 pCDNA cells were plated on dishes in serum-free media at a density of approximately 6000 cells/ cm^2 and allowed to adhere for 2 hours before media was changed to bicarbonate-free serum-free media at pH 6.5 or 7.4. MnCl_2 (1 mM) or soluble GRGDSPC peptide (200 $\mu\text{g}/\text{mL}$) was also added within this media exchange for some sample conditions, as indicated. Eight hours after the media change, optical images of cells were acquired and analyzed to measure

circularity ($4\pi A/P^2$, where A is the projected cell area and P is the cell perimeter). At least 50 cells were analyzed for each condition. Results demonstrate that circularity is significantly decreased for $\alpha_v\beta_3$ CHO-B2 cells in pH 6.5 (Columns 1 and 2, asterisk represents $p < 0.0001$). There was no significant difference in circularity for $\alpha_5\beta_1$ CHO-B2 cells in the presence of RGD at pH 6.5 vs. pH 7.4 (Columns 3 and 4), CHO-B2 pCDNA cells at pH 6.5 vs. pH 7.4 (Columns 5 and 6), or $\alpha_v\beta_3$ CHO-B2 cells in the presence of Mn^{2+} at pH 6.5 vs. pH 7.4 (Columns 7 and 8). (TIF)

Figure S5 Mean migration speed as a function of fibronectin coating concentration on glass-bottom dishes for cells in media at pH 7.4. Maximum migration speed occurred at 30 $\mu\text{g/ml}$ fibronectin, compared to 1 $\mu\text{g/ml}$ fibronectin when cells are plated on fibronectin-coated polystyrene (Figure 6C, main text). Statistical significance of maximum

migration speed value: 10 vs. 30 $\mu\text{g/ml}$, $p < 0.01$; 30 vs. 50 $\mu\text{g/ml}$, $p < 0.001$; 30 vs. 60 $\mu\text{g/ml}$, $p < 0.001$. Error bars represent SEM.

(TIF)

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Author Contributions

Conceived and designed the experiments: RKP KJVJ DAL. Performed the experiments: RKP. Analyzed the data: RKP KJVJ DAL. Contributed reagents/materials/analysis tools: KJVJ DAL. Wrote the manuscript: RKP KJVJ DAL.

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