

ARTICLE

https://doi.org/10.1038/s41467-021-26454-x

OPEN

Mechanics-driven nuclear localization of YAP can be reversed by N-cadherin ligation in mesenchymal stem cells

Cheng Zhang ^{1,2,11}, Hongyuan Zhu ^{1,2,11}, Xinru Ren^{1,2}, Bin Gao³, Bo Cheng^{1,2}, Shaobao Liu⁴, Baoyong Sha⁵, Zhaoqing Li^{1,2}, Zheng Zhang^{1,2}, Yi Lv⁶, Haohua Wang⁶, Hui Guo⁷, Tian Jian Lu^{4,8}, Feng Xu^{1,2}, Guy M. Genin ^{1,2,9,10} & Min Lin ^{1,2 ⊠}

Mesenchymal stem cells adopt differentiation pathways based upon cumulative effects of mechanosensing. A cell's mechanical microenvironment changes substantially over the course of development, beginning from the early stages in which cells are typically surrounded by other cells and continuing through later stages in which cells are typically surrounded by extracellular matrix. How cells erase the memory of some of these mechanical microenvironments while locking in memory of others is unknown. Here, we develop a material and culture system for modifying and measuring the degree to which cells retain cumulative effects of mechanosensing. Using this system, we discover that effects of the RGD adhesive motif of fibronectin (representative of extracellular matrix), known to impart what is often termed "mechanical memory" in mesenchymal stem cells via nuclear YAP localization, are erased by the HAVDI adhesive motif of the N-cadherin (representative of cell-cell contacts). These effects can be explained by a motor clutch model that relates cellular traction force, nuclear deformation, and resulting nuclear YAP re-localization. Results demonstrate that controlled storage and removal of proteins associated with mechanical memory in mesenchymal stem cells is possible through defined and programmable material systems.



¹The Key Laboratory of Biomedical Information Engineering of Ministry of Education, School of Life Science and Technology, Xi'an Jiaotong University, Xi'an 710049, People's Republic of China. ² Bioinspired Engineering and Biomechanics Center (BEBC), Xi'an Jiaotong University, Xi'an 710049, People's Republic of China. ³ Department of Endocrinology, Second Affiliated Hospital of Air Force Military Medical University, Xi'an 710038, People's Republic of China. ⁴ State Key Laboratory of Mechanics and Control of Mechanical Structures, Nanjing University of Aeronautics and Astronautics, Nanjing 210016, People's Republic of China. ⁵ School of Basic Medical Science, Xi'an Medical University, Xi'an 710021, People's Republic of China. ⁶ National Local Joint Engineering Research Center for Precision Surgery & Regenerative Medicine, Shaanxi Provincial Center for Regenerative Medicine and Surgical Engineering, The First Affiliated Hospital of Xi'an Jiaotong University, Xi'an 710061 Shaanxi, People's Republic of China. ⁸ MOE Key Laboratory of Multifunctional Materials and Structures, Xi'an Jiaotong University, Xi'an 710049, People's Republic of China. ⁹ Department of Mechanical Engineering & Materials Science, Washington University in St. Louis, St. Louis 63130 MO, USA. ¹⁰ NSF Science and Technology Center for Engineering Mechanobiology, Washington University in St. Louis, St. Louis 63130 MO, USA. ¹¹These authors contributed equally: Cheng Zhang, Hongyuan Zhu. ⁸⁴ email: minlin@xjtu.edu.cn

uman mesenchymal stem cells (hMSCs) differentiate into a range of cell types depending in part upon the mechanical cues they received¹⁻⁴. These cues can vary dramatically during development⁵, healing⁶, cancer⁷ and regenerative therapies⁸, due to stochastic variations, stress concentrations, and cell culture protocols. For example, in regenerative applications^{9,10}, MSC populations are typically expanded on stiff (~3 GPa¹¹) plastic substrates for relatively long intervals and must forget these mechanical signals prior to transplantation into compliant (~kPa) in vivo microenvironments. Understanding how MSCs learn to forget their previous mechanical microenvironment variations holds potential for improving MSC therapies.

The opposite problem - the ways that MSCs learn and remember their mechanical environments - has been long studied in isolated MSCs. A key indicator of the degree to which MSCs perceive and transduce mechanobiological signals and commit to a lineage-based upon these is the action of the YAP/TAZ transcriptional co-regulators¹²⁻¹⁴. Nuclear compartmentalization of YAP/TAZ in MSCs cultured on relatively stiff substrates activates signaling pathways that promote osteogenesis^{15–17}, while cytoplasmic retention of YAP/TAZ in MSCs cultured on relatively compliant substrates promotes adipogenesis^{18–20}. Sufficiently long (~10 d) exposure of MSCs to stiff substrates causes nuclear accumulation of YAP/TAZ that is retained to influence long-term cell fate, a phenomenon that is widely termed "mechanical memory"11,21. For example, MSCs retain their osteogenic differentiation course when re-exposed to compliant substrates, with the nuclear accumulation of YAP/TAZ becoming apparently irreversible¹¹. Several pathways have been identified for this persistence, in addition to the cytoplasm-nucleus shuttling of YAP, including a role for cytoplasmic miR-21 whose presence extends the persistence of the effects of stiff (100 kPa) substrates in MSCs subsequently cultured on soft (15 kPa) hydrogels, and whose knockdown effectively eliminates this persistence²².

However, cells, including differentiating MSCs, rarely exist in isolation in vivo^{14,23}. Two questions thus arise: how do MSCs know to take cues from their extracellular matrix (ECM) rather than from their compliant neighbors, and can MSCs use information from their neighbors to learn when to forget previous mechanical information? Cell-cell contact affects mechanosensation, with confluent cells that have reached a stable density showing cytoplasmic re-localization of YAP/TAZ²⁴⁻²⁶. Cell-ECM connections (focal adhesions) and cell-cell connections (cadherin junctions) share the same cytoskeletal force network and have many other similarities²⁷⁻²⁹. Sufficiently high adhesion or contractile force in this cytoskeletal network causes YAP to translocate to the nucleus^{30,31}. However, there is a trade-off: cell-ECM adhesion weakens cell-cell adhesion, and vice versa³², with FAK activation³³ from strong integrin-ECM connections^{34,35} downregulating VE-cadherin-36,37 and N-cadherin-28,38 mediated intercellular connections. Adhesion ligation experiments reveal that N-cadherin connections compete with integrin connections to mediate force and determine YAP localization, MSC mechanosensing, and MSC fate^{39,40}. N-cadherin clearly affects YAP localization and MSC behavior, but has not been studied in the context of "mechanical memory".

In this work, we hypothesize that N-cadherin in cell-cell interactions could reverse these effects ("erase" mechanical memory) in MSCs by restoring YAP to the cytoplasm. We thus develop a material system with independently or jointly presented RGD peptides for cell-ECM adhesion and HAVDI peptides for cell-cell adhesion. We harness this to query how these adhesive interactions interact to affect persistent cellular changes in hMSCs in response to mechanosensing, and apply this to control the differentiation of hMSCs.

Results and discussion

Physiological responses to cell-cell interactions can be mimicked by HAVDI immobilized on a hydrogel. To elucidate how N-cadherin affects YAP localization, we developed a dualpeptide functionalized PEG hydrogel analogous to the hyaluronic acid (HA) based hydrogel of Cosgrove et al.³⁹. The PEG hydrogel system presented either HAVDI/RGD (from N-cadherin, representing neighboring cells), or non-functional scrambled HAVDI sequence (Scram) combined with RGD (Scram/RGD) (Fig. 1). 8-arm PEG maleimide (PEG-MAL) modified with monothiolated peptides was subsequently crosslinked by 8-arm PEG thiol (PEG-SH) via Michael addition) (Fig. 1a)⁴¹. As with analogous HA hydrogels, PEG hydrogels modified with 1 mM RGD and 1 mM non-functional scrambled HAVDI sequence (Scram/ RGD) established only integrin adhesions, while PEG hydrogels modified with 1 mM RGD and 1 mM HAVDI enabled both integrin and N-cadherin mediated interactions (HAVDI/RGD) (Fig. 1b and Supplementary Fig. 1). Concentrations of HAVDI peptides followed Cosgrove et al.³⁹, and were within the range of E-cadherin density at adherens junctions in monolayer epithelial cells of developing Drosophila embryos⁴². The grafted peptide was observed to distribute homogeneously on the surface of hydrogels (Supplementary Fig. 1). The binding efficiency of peptide to the PEG backbone was measured at over 86% (Supplementary Fig. 2). Through the binding efficiency, we calculated the surface concentrations of peptides, which fell into a reasonable range (Supplementary Text).

Hydrogel stiffness could be tuned independently from 2-41 kPa by varying relative concentrations of PEG-SH and PEG-MAL (Fig. 1c). Modification with HAVDI/RGD or Scram/RGD did not affect Young's moduli of the hydrogel over the range of concentrations of PEG-SH and PEG-MAL used in this study (Fig. 1c). Young's moduli were obtained from load-indentation curves (Supplementary Fig. 3). When we seeded cells on the hydrogels with different stiffness and peptide, cell area increased with increasing substrate stiffness, in accordance with previous studies^{43,44}; no significant difference was observed between the Scram/RGD and HAVDI/RGD groups (Supplementary Fig. 4). Results indicated that the HAVDI peptide did not affect cell spreading, and differences in YAP n/c ratio observed between Scram/RGD and HAVDI/RGD hydrogels did not arise from difference in cell area.

We began by using this system to establish whether HAVDI presentation faithfully replicates the N-cadherin clustering and β -catenin recruitment associated with N-cadherin-mediated cell-cell interactions. These two mechanosensing proteins accumulate as force transmission between cells matures adherens junctions via an α -catenin/vinculin dependent pathway⁴⁵. To study this, we cultured hMSCs at prescribed cell densities and levels of confluence on Scram/RGD or HAVDI/RGD hydrogels with a stiffness of 20 kPa for 3 d, then fixed and stained the hMSCs for N-cadherin and β -catenin on their basal planes (Fig. 2a).

Sparse cells that had no contact with their neighbors showed neither N-cadherin clustering nor β -catenin recruitment when cultured on Scram/RGD hydrogels (Fig. 2b). However, N-cadherin clustering and β -catenin co-localization were rescued in sparse cells cultured upon HAVDI/RGD hydrogels (Fig. 2c). Likewise, confluent cells, which formed adherens junctions with their neighbors, showed clustering of N-cadherin as well as recruitment and co-localization of β -catenin on both the HAVDI/ RGD and Scram/RGD hydrogels (Fig. 2d). To check whether



Fig. 1 Peptide-functionalized PEG gels that mimic integrin and cadherin adhesion. a Mono-thiolated peptides functionalized PEG backbone (8-arm PEG maleimide, PEG-MAL) and subsequent crosslinking with 8-arm PEG thiol (PEG-SH) via Michael addition reaction. **b** Schematic of PEG-MAL hydrogels modified with HAVDI and RGD peptides acting as N-cadherin and fibronectin adhesive domains, respectively. Scram/RGD hydrogel substrate allows only integrin/RGD interactions, while HAVDI/RGD substrate allows both integrin/RGD and N-cadherin/HAVDI interactions. **c** Young's moduli of hydrogels synthesized at different PEGSH concentrations without peptide (No peptide) or with peptide (Scram/RGD or HAVDI/RGD). Results indicated that modification of peptides did not alter the stiffness of PEG hydrogels in this system. The data represented the mean ± s.e.m., from left to right, n = 60, 66, 47, 31, 60, 30, 30, 89, 50, 50, 60, 46, 65 points respectively, adopted from 3 independent samples for each group (*p* values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). Source data are provided as a Source Data file.

N-cadherin co-localized with β -catenin, the percentage of N-cadherin area that was also positive for β -catenin was quantified from fluorescence images using a custom MATLAB (R2014a) script that implemented standard cross-correlation techniques from the literature^{39,46} (Supplementary Fig. 5). For both sparse and confluent cells, significantly more co-localization (*i.e.*, N-cadherin area positive for β -catenin) was observed for cells cultured on HAVDI/RGD hydrogels than for cells cultured on Scram/RGD hydrogels, indicating that substrates with immobilized HAVDI induced both N-cadherin clustering and β -catenin recruitment.

Treatment with 1 mM soluble HAVDI(-C) peptide, designed to bind with membrane N-cadherin receptors while avoiding conjugation to the PEG-Mal backbone, blocked recruitment and co-localization of N-cadherin and β -catenin in cells cultured on both Scram/RGD and HAVDI/RGD hydrogels (Supplementary Fig. 6). These results suggested that HAVDI/N-cadherin ligation arising in cells cultured on HAVDI/RGD hydrogels served to generate force from substrates triggering recruitment and colocalization β -catenin forming force bearing proteins chain.

HAVDI ligation reverses YAP nuclear localization in hMSCs. HAVDI presentation is known to affect nuclear localization of YAP³⁹. Immunostaining that replicated this result in our PEG system showed nucleus-to-cytoplasm (n/c) ratios of YAP significantly attenuated by HAVDI presentation over an intermediate range of substrate moduli (10~20 kPa), but unaltered for compliant (~1 kPa) or stiff (~40 kPa) substrates (Fig. 2e–f). Consistent with the observations of others^{15,39,47–50}, our myosin inactivation experiments showed YAP signaling to be highly dependent on the contractile state of the cell (Fig. 2f). After myosin inactivation using blebbistatin, we found that all YAP n/c ratios dropped to the same level for both the Scram/RGD and HAVDI/RGD hydrogels, independent of substrate moduli (2-41



Fig. 2 N-cadherin clustering and β-catenin recruitment in mimetic PEG hydrogels and stiffness dependent YAP nuclear localization via N-cadherin signaling. a HAVDI ligation caused sparse cells to adopt the N-cadherin and β-catenin patterning of confluent cells, as evident from confocal images of DAPI (blue), N-cadherin (green) and β-catenin (purple) staining in hMSCs cultured on either sparse (non-confluent) or confluent conditions on Scram/RGD or HAVDI/RGD hydrogels of Young's modulus 20 kPa. The white arrow highlights real cell-cell adhesions between neighboring hMSCs; the yellow arrow highlights N-cadherin/HAVDI binding for an isolated hMSC on a HAVDI/RGD hydrogel. Scale bar: 20 µm. **b-d** Representative subcellular distributions of N-cadherin and β-catenin patterning of confluent cells. Scale bars: 5 µm. **b** Isolated cells on Scram/RGD hydrogels, which do not mimic cell-cell adhesions, did not show substantial N-cadherin clustering or β-catenin recruitment. **c** Isolated cells cultured on HAVDI/RGD hydrogel, which mimicked cell-cell adhesions, showed N-cadherin clustering or β-catenin recruitment that was indistinguishable from that in **d** confluent cells on Scram/RGD hydrogels. Yellow lines in **b-d** indicate the pixel regions of interest used to generate intensity profiles of N-cadherin (green) and β-catenin (purple). **e** Confocal images of YAP immunostaining on hMSCs cultured on 2, 11, 20 and 41 kPa Scram/RGD or HAVDI/RGD hydrogels for 3 d. Scale bars, 20 µm. **f** Quantification of YAP n/c ratios on Scram/RGD or HAVDI/RGD hydrogels of increasing stiffness with or without blebbistatin (myosin inhibitor) as shown in **e** (from left to right n = 82, 87, 79, 74, 126, 71, 60, 65, 71, 68, 53, 35, 105, 82, 39, 63 cells examined over 14, 13, 16, 18, 17, 16, 27, 19, 15, 13, 19, 24, 9, 9, 23, 27 images respectively,*p*values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). Source data are provided as a Source Data file.

kPa). These results suggested that actomyosin inhibition shielded the mechanosensing of substrates stiffness by cells^{48–50}. In addition, differences of YAP n/c ratio on substrates with different peptides could be attributed to different actomyosin contractility, because myosin inactivation could eliminate the observed HAVDI effect.

To quantify how peptide concentrations affect nuclear localization of YAP, we varied the HAVDI/Scram/RGD peptide concentration ratios on hydrogels while keeping the total effective ligand density constant. Increasing RGD presentation resulted in unchanged YAP nuclear-to-cytoplasmic (n/c) ratios on Scram/RGD hydrogels, indicating that 0.25 mM RGD was sufficient to induce a maximal YAP n/c ratio (Supplementary Fig. 7). Cells on HAVDI/RGD hydrogels showed lower YAP n/c ratios, with the differential becoming more pronounced with increasing HAVDI concentration. These results suggested that the increasing RGD concentration (\geq 0.25 mM) did not affect YAP nuclear translocation measurably, while increasing HAVDI concentration inhibited it.

We therefore chose two hydrogels with a fixed, intermediate stiffness (Young's modulus = 20 kPa) and two different peptide

combinations (Scram/RGD for 1 mM Scram and 1 mM RGD peptides, HAVDI/RGD for 1 mM HAVDI and 1 mM RGD peptides) to test the hypothesis that N-cadherin ligation can reverse nucleus-to-cytoplasm shuttling of YAP.

Before studying this reversal of nucleus-to-cytoplasm shuttling of YAP, we repeated earlier results showing that sparse hMSCs developed significantly higher YAP nuclear localization when cultured on Scram/RGD hydrogels than when cultured on HAVDI/RGD hydrogels (Supplementary Fig. 8a, upper-left; Supplementary Fig. 8b, left); blocking N-cadherin with soluble HAVDI(-C) peptide (1 mM) restored the YAP n/c ratio in sparse hMSCs cultured on HAVDI/RGD substrates to the level seen in hMSCs cultured on Scram/RGD substrates (Supplementary Fig. 8a, lower-left; Supplementary Fig. 8b, left), consistent with the observations of Cosgrove et al.³⁹. YAP was excluded from the nucleus in hMSCs in confluent cells cultured on either Scram/RGD or HAVDI/RGD substrates (Supplementary Fig. 8a, upper-right; Supplementary Fig. 8b, right), consistent with previous studies^{15,18,25} and suggesting that cell-cell interactions inhibited nuclear localization of YAP. Blocking N-cadherin with soluble HAVDI(-C) peptide abrogated this inhibition in confluent cells as well (Supplementary Fig. 8a, lowerright; Supplementary Fig. 8b, right), indicating that N-cadherin mechanoresponsiveness controlled YAP exclusion associated with both real and mimicked cell-cell interactions.

We next tested the hypothesis that YAP nuclear localization, known to arise from priming of cells on stiff tissue culture plastic (TCP, ~3 GPa), could be reversed by N-cadherin signaling from HAVDI/RGD substrates. For this, hMSCs were cultured on TCP for 1-10 d, and then transferred to soft (20 kPa) HAVDI/RGD or Scram/RGD hydrogels for 3 or 10 d (Fig. 3a). As seen by others¹¹, the YAP n/c ratio in hMSCs increased with increasing culture time on TCP (Fig. 3b, "no transfer"). When hMSCs were transferred to Scram/RGD or HAVDI/RGD hydrogels after 1 d on TCP substrate (DT1), the YAP n/c ratio returned to the levels seen in cells that had never been exposed to TCP ("soft control" group), which suggested that YAP nuclear localization was fully reversible over 1 d (DT1 + So1) (Fig. 3c). Longer culture time on soft gels (DT1 + So3) did not change the YAP n/c ratio, suggesting that the kinetics of YAP nuclear localization reached a steady state within 1 d.

This observation was in accordance with previous studies that after substrate softening, the YAP n/c ratio reduced to baseline levels within 1 d and maintained these levels for up to 10 d²¹. Cui et al. found that nuclear accumulation of YAP reached a steady state within 6 h⁵¹, and Elosegui-Artola et al. found that YAP n/c ratio changed within several minutes after nuclear force is applied³¹. To exclude the possible effects of mechanical stimuli generated by cell passaging, we conducted experiments where cells were transferred from TCP to TCP. The YAP n/c ratio showed no difference between groups that had undergone passaging (DT3 + DT0.25 and DT3 + DT3 in Supplementary Fig. 9) and those that had not (DT3.25 and DT6 in Supplementary Fig. 9), indicating that mechanical stimuli associated with transferring substrates had no measurable effect on the MSC mechanosensing or memory.

In hMSCs cultured for 3 d on TCP (DT3) and subsequently transferred to soft HAVDI/RGD hydrogels for 1 d (DT3 + So1), the YAP n/c ratio recovered to the level of "soft control" group. Further increasing the culture time on soft HAVDI/RGD hydrogels to 3 d did not change the YAP n/c ratio. This suggested that YAP nuclear localization was again fully reversed within 1 d (Fig. 3d). In contrast, transferring to Scram/RGD hydrogels led to a higher YAP n/c ratio than that observed in the "soft control" group, suggesting that YAP nuclear localization was only partially reversible under these conditions (Fig. 3d). After 7 d on TCP (DT7), YAP nuclear localization was partially reversible

in cells transferred to either Scram/RGD or HAVDI/RGD hydrogels; the YAP n/c ratio of cells transferred to HAVDI/ RGD gels dropped more than those of cells transferred to Scram/ RGD gels (Supplementary Fig. 10).

In hMSCs cultured for 10 d on TCP (DT10) and then transferred to Scram/RGD hydrogels, the YAP n/c ratio remained the much higher levels in cells in the "soft control" group with 1-10 d culture time. However, transferring to HAVDI/RGD hydrogels led to a drop of the YAP n/c ratio within 1 d to a level that remained constant for up to 10 d culture time. This confirmed that 10 d of culture on TCP made YAP nuclear localization irreversible in cells transferred to soft Scram/RGD hydrogels, as observed in previous studies^{11,21}, and revealed that YAP nuclear localization was again partially reversible in hMSCs transferred to HAVDI/RGD hydrogels (Fig. 3e). Increasing HAVDI concentration increased the magnitude of the drop in YAP n/c ratio (Supplementary Fig. 11).

Thus, hMSCs integrated and stored nuclear YAP when exposed to stiff TCP. This was increasingly persistent in response to increasing mechanical dosing on TCP, but could be partially or entirely reversed via HAVDI ligation that mimicked N-cadherin signaling in cell-cell interactions.

HAVDI ligation can be used to control stem cell fate. To demonstrate therapeutically useful reversal of YAP nuclear localization in hMSCs, we explored whether the seemingly irreversible, osteogenic commitment of hMSCs¹¹ could be reversed by HAVDI ligation. Yang, et al., demonstrated that priming of hMSCs for 10 d on stiff substrates resulted in nuclear localization of the osteogenic marker RUNX2 even after in-situ softening of the substratum for 10 d¹¹. We found similar results for cells cultured in growth medium for 1-7 d on TCP (~3 GPa) then transferred to soft (20 kPa) Scram/RGD hydrogels for 3 d in osteogenic medium (Fig. 4a), with nuclear localization of RUNX2 increasing with increasing culture time on TCP (Fig. 4b, c). However, in cells that were instead transferred from TCP to soft (20 kPa) HAVDI/RGD hydrogels, a negligible increase of RUNX2 nuclear localization was observed following stiff priming of up to 3 d, and elevation of RUNX2 levels was greatly attenuated for stiff priming of 7 d.

To verify that the observed RUNX2 nuclear localization was indicative of osteogenesis, the late osteogenic markers alkaline phosphatase (ALP) and osteocalcin $(OCN)^{52,53}$ were tracked in hMSCs that were exposed to TCP for 1-7 d in growth medium, and that were then transferred onto soft (20 kPa) Scram/RGD or HAVDI/RGD hydrogels for 7 d in osteogenic differentiation medium before being fixed and stained (Fig. 4a). Consistent with the results of Yang, et al.¹¹, ALP and OCN expression increased with increasing culture time on TCP for hMSCs transferred to Scram/RGD hydrogels (Fig. 4d–g). However, HAVDI ligation significantly attenuated both ALP and OCN levels, verifying that HAVDI ligation diminished osteogenic commitment. These findings demonstrated HAVDI ligation as a tool for attenuating nuclear localization of YAP and sustaining stem cell plasticity during in vitro expansion.

HAVDI dependent motor-clutch dynamics affect the mechanical sensation and nuclear translocation of YAP. Growing evidence implicates a motor-clutch machine of myosin, actin filaments, and focal adhesion complexes^{54,55} in sensation of extracellular matrix (ECM) stiffness^{56–58}. The forces associated with actomyosin contraction increase with substrate stiffness because of increased resistance to contraction, increased engagement of the motor-clutch mechanism, and increased development of polarized stress fibers. The forces associated with



increased traction on the substrate also deform the nucleus and can initiate nuclear-cytoplasmic shuttling of YAP and downstream signaling pathways^{31,59}. We hypothesized that N-cadherin affected mechanical sensation and the YAP n/c ratio ($R_{\rm NC}$) by inhibiting the rate $k_{\rm on}$ of integrin binding, and hence reducing integrin clustering, tractions, and nuclear deformation. To test this hypothesis about the effects of HAVDI ligation, we applied a motor-clutch model (model details in Supplementary Methods and Supplementary Table 1)^{56–58,60}.

Briefly, in the motor-clutch model (Fig. 5a), actin filaments attached to ECM through dynamic bonds at integrin clutches with binding rate ($k_{\rm on}$) and unbinding rate ($k_{\rm off}$), while myosin motors contracted the actin filaments with traction force ($F_{\rm trac}$) at velocity ($v_{\rm f}$). The actin filament deformed the nucleus and substrate

6

Fig. 3 HAVDI ligation reversed YAP nuclear localization in hMSCs. a Schematic of the experimental protocol for assessing the role of HAVDI on reversing YAP nuclear localization in hMSCs. YAP accumulation in the nucleus was measured in hMSCs cultured on TCP (dark purple) in growth medium (pink) for 1, 3, 7, or 10 d, denoted DT1, DT3, DT7, and DT10, respectively. Reversal of YAP nuclear accumulation was assessed in hMSCs that were cultured on TCP in growth medium for these same time intervals, but then transferred (light yellow, day 0) to either soft (20 kPa) Scram/RGD (orange) or soft (20 kPa) HAVDI/RGD (blue) hydrogels for 1-10 d in growth medium before collection and analysis (grav. day 1-10). These conditions were denoted (DT1 + So1, 3), (DT3 + So1, 3), (DT7 + So1, 3, 10), or (DT10 + So1, 3, 5, 7, 10). Control cases included 3 d of cell culture on soft Scram/RGD (orange) or HAVDI/RGD (blue) hydrogels (So3), denoted "soft control (S/R)" and "soft control (H/R)", respectively. b Representative immunostaining images of hMSC nuclei (blue) and YAP (green) after specified treatments on stiff and soft substrates as shown in a. Scale bars, 20 µm. S/R is Scram/RGD, H/R is HAVDI/RGD. c-e Quantification of YAP nuclear/cytoplasmic (n/c) ratios in hMSCs after specified treatments on stiff and soft substrates as shown in a. S/ R (orange) and H/R (blue) represent all conditions related to soft Scram/RGD and HAVDI/RGD hydrogels, respectively. Soft control (S/R) and soft control (H/R) are baselines of YAP n/c ratios after 3 d culture for the S/R and H/R groups, respectively. YAP n/c ratio increased with culture time on TCP. c After 1 d of culture on TCP (purple, DT1), YAP localized to the nucleus (from left to right n = 108, 79, 70, 71, 108, 120, 100, 68 cells examined over 5, 11, 23, 15, 5, 26, 13, 13 images respectively, p values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). Following transfer of hMSCs to either soft Scram/RGD (orange) or soft HAVDI/RGD (blue) substrates and culture for 1 d or 3 days (DT1 + So1, 3), the YAP n/c ratios decreased separately to the baseline of soft control S/R or H/R levels, showing a fully reversible YAP nuclear accumulation. d Following 3 d of culture on TCP (DT3), the YAP n/c ratio remained above the baselines of soft control in hMSCs transferred to Scram/RGD substrates for 1 d or 3 d (S/R: DT3 + So1, 71, 108, 85, 68, 72, 68 cells examined over 5, 6, 17, 15, 15, 5, 6, 19, 6, 13 images respectively, p values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). This showed that, following 3 d of culture on TCP. YAP nuclear localization was partially reversible response without HAVDI (S/R), but fully reversible with HAVDI (H/R). e Following 10 d of culture on TCP (DT10), the YAP n/c ratio remained elevated and unchanged in hMSCs transferred to Scram/RGD substrates for up to 10 d (S/R: DT10 + So1, 3, 5, 7, 10), but decreased towards baseline levels within 1 d and maintained 84, 84, 71, 108, 85, 66, 76, 70, 75, 102, 70, 78, 68 cells examined over 5, 6, 9, 11, 16, 21, 21, 23, 26, 15, 5, 6, 9, 11, 28, 21, 37, 20, 8, 13 images respectively, p values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). This showed that, following 10 d of culture on TCP, YAP nuclear accumulation was permanent (irreversible) over the experimental timescale without HAVDI (S/R), but partially reversible with HAVDI (H/R). Source data are provided as a Source Data file.

simultaneously. The nucleus was regarded as viscoelastic, with elastic deformation that recovered transiently with reduced traction force and inelastic deformation that accumulated loading (culture) time on TCP. As expected, cell traction forces increased with substrate stiffness (E_{sub}) due to the tension-mediated recruitment of integrin, which resulted in a higher k_{on} on stiffer substrates⁵⁷. The range of k_{on} depended upon the integrin density on the membrane⁶⁰. N-cadherin could downregulate traction force and focal adhesion length over an intermediate range of E_{sub} (5–20 kPa)³⁹, due to lower integrin density and lower k_{on} ⁶⁰. In our model, an Arrhenius relationship was used to relate k_{on} and E_{sub} to the presentation of HAVDI (details in Supplementary Methods) (Fig. 5b). The different $k_{on} - E_{sub}$ relationships on Scram/RGD and HAVDI/RGD hydrogels resulted in double sigmoidal relationships between F_{trac} and E_{sub} (Fig. 5c). The stiffness threshold for elevating traction force was thus higher on HAVDI/RGD substrates than on Scram/RGD substrates.

Stress fibers alignments are well known to respond dynamically to the mechanics of the cellular microenvironment⁶¹⁻⁶³. To validate model predictions, we first measured the organization of F-actin (quantified by F-actin anisotropy). In accordance with prior observations³⁹, F-actin anisotropy increased with substrate stiffness, and decreased significantly in presence of HAVDI on substrates of intermediate stiffness (20 kPa) (Supplementary Fig. 12). We then performed traction force microscopy for cells cultured on substrates of prescribed peptide mixtures and stiffness. For cells seeded on Scram/RGD hydrogels, the traction increased with increasing hydrogel stiffness (Supplementary Fig. 13). For cells seeded on HAVDI/RGD hydrogels, consistent with observations of Cosgrove et al.³⁹ and our models, tractions were reduced by HAVDI presentation on substrates with an intermediate range of substrate moduli (10-20 kPa), but unaltered for compliant (1 kPa) or stiff (41 kPa) substrates (Fig. 5c). These results verified the prediction that MSC mechanosensing, and the peptide dependence thereof, required actomyosin contractility.

The model predicted that $R_{\rm NC}$ increased with increasing nuclear deformation, due to previously reported increases in the

rate of translocation of cytoplasmic YAP to the nucleus³¹. In our model, HAVDI/RGD and Scram/RGD substrates yielded different tractions, nuclear deformation, pore sizes and hence $R_{\rm NC}$ (Fig. 5d). We hypothesized that actomyosin contractility affects nuclear deformation, which in turn affects the YAP n/c ratio. We thus characterized the nuclear flattening ($\lambda_{\rm N}$, nuclear length/height), a measure of nuclear deformation evidenced from our confocal images, and confirmed that it increased monotonically with increasing $F_{\rm trac}$ (Fig. 5e, Supplementary Fig. 14). As predicted, nuclear flattening was proportional to $R_{\rm NC}$ (Fig. 5f), an effect attributed to the enlargement of nuclear pores in deformed nuclei that promoted YAP import rate without changing the export rate³¹. Thus, $R_{\rm NC}$ served as a proxy for nuclear deformation in our model.

Our predictions of R_{NC} matched trends observed in our experiments, and were consistent with the model that HAVDI and stiffness co-determined k_{on} , and that this effect gave rise to the observed double sigmoidal relationships between $R_{\rm NC}$ and $E_{\rm sub}$ on substrates with and without HAVDI, showing attenuated YAP nuclear localization (Fig. 5g). After this verification of the reasonability of our model for k_{on} , the model was used to reproduce the phenomena observed in Fig. 3. Consistent with other observations of nuclear deformation, the nucleus was treated as viscoelastic, with deformation having both elastic (reversible) and plastic (irreversible) components^{64–66}. Our model predicted the reductions in $R_{\rm NC}$ over time following transferal of MSCs from TCP to soft hydrogels, and attributed these trends to reductions in tractions associated with release of elastic deformation of the nucleus. The plastic deformation of the nucleus captured the observed increase in R_{NC} with increasing culture time on TCP (Fig. 5h). In cells transferred from TCP to soft gels, the elastic deformation recovered while the plastic deformation remained, reducing $R_{\rm NC}$ over time. $R_{\rm NC}$ in cells transferred to HAVDI/RGD substrates was lower than in those transferred to Scram/RGD substrates because HAVDI reduced traction and thus facilitated elastic recovery. Results suggested that effects of HAVDI on mechanical sensation and nuclear translocation of YAP observed ARTICLE



in our culture system could be explained through motor-clutch dynamics.

MSCs in vivo receive mechanical cues from both cell-ECM and cell-cell adhesions, with the former promoting mechanosensing and the latter inhibiting it. We showed that these two antagonistic factors also affect nuclear translocation of YAP, and found that N-cadherin signaling can reverse these effects arising from cellECM adhesions. This is important for regenerative therapies¹⁰ involving in vitro expansion of MSCs on TCP and subsequent in vivo transplantation, which must overcome the effects of TCP exposure that bias MSCs toward osteogenic differentiation. Using PEG hydrogels with co-presentation of RGD and HAVDI peptides that we showed to mimic cell-ECM and cell-cell adhesions, we demonstrated that HAVDI signaling can be used

Fig. 4 The HAVDI/RGD hydrogel can be used to reduce long-term retention of the effects of mechanotransduction and inhibit osteogenic differentiation of hMSCs. a Schematic of the experimental protocol for assessing osteogenic differentiation of hMSCs cultured on TCP for 1-7 d, followed by 3 d (for RUNX2) or 7 d (for OCN and ALP) culture on 20 kPa Scram/RGD or HAVDI/RGD hydrogels. hMSCs were cultured on TCP (dark purple) in growth medium (pink) for 1, 3, or 7 d and then transferred (light yellow, day 0) to soft Scram/RGD (orange) or HAVDI/RGD (blue) hydrogels for additional 3 d or 7 d of culture in osteogenic medium (light blue) before collection and analysis (grav. day 3 or day 7). RUNX2 expression was assessed in the conditions denoted So3 (soft control, without culture on TCP), DT1 + So3, DT3 + So3, or DT7 + So3. OCN and ALP expression were assessed in the conditions denoted So7 (soft control, without culture on TCP), DT1 + So7, DT3 + So7, or DT7 + So7. b Representative confocal images of cells stained for RUNX2, a marker of early osteogenic differentiation, in hMSCs following treatment as shown in a. Scale bars, 20 µm. c Analysis of confocal images showed a significant increase in the RUNX2 n/c ratio with increasing exposure to TCP in hMSCs transferred to Scram/RGD hydrogels (from left to right n = 77, 49, 59, 73, 72, 44, 84, 92 cells examined over 7, 15, 19, 20, 12, 24, 23, 26 images respectively, p-values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). However, effects of TCP were evident only after 7 days of exposure to TCP in hMSCs transferred to HAVDI/RGD hydrogels, and was greatly attenuated compared to Scram/RGD for 7 days of mechanical dosing on TCP. d-g Representative images of staining for late osteogenic differentiation markers OCN (d) and ALP (f) in hMSCs following the treatment shown in a. Scale bars, 20 µm. Quantification of the percentage of OCN-positive cells (e) and ALP-positive cells (g) affirmed that HAVDI ligation significantly attenuated osteogenic differentiation after mechanical priming on TCPS (n = 3 experiments per group, p values were obtained using one-way ANOVA followed by Tukey's post hoc test, mean ± s.e.m.). Source data are provided as a Source Data file.

to reverse a nuclear translocation of YAP, as well as sustained mechanosensing effects in the form of RUNX2, ALP and OCN activity by altering the motor-clutch dynamics in MSCs. Taken together, results show that N-cadherin signaling arising from cellcell adhesion reduces long-term retention of the effects of mechanotransduction in MSCs and can be used to engineer cell culture platforms to modulate "mechanical memory" in hMSCs.

Methods

Preparation of PEG hydrogels and peptide conjugation. PEG hydrogels were prepared from 8-arm PEG maleimide (hexaglycerol) (PEG-MAL, 10 kDa, JenKem Technology) backbone and 8-arm PEG thiol (hexaglycerol) (PEG-SH, 10 kDa, JenKem Technology) crosslinker. RGD peptides (GCGYGRGDSSPG) for fibronectin, and HAVDI (HAVDIGGGC) or scrambled HAVDI control (AGVGD-HIGC) peptides for N-cadherin (Sangon Biotech, Shanghai) were covalently conjugated to the PEG-MAL backbone via Michael addition reactions between the cysteine residues on these peptides and the maleimide on the PEG-MAL backbone. PEG-MAL (5 mM) and peptides were dissolved in phosphate-buffered saline (PBS) for 1 h at 37 °C for peptide conjugation. For these studies, all peptides were used at a final concentration of 1 mM in hydrogels (except for hydrogel control without any peptide conjugation).

Hydrogel fabrication and characterization. Hydrogels with a final thickness of $\sim 200 \,\mu\text{m}$ were formed after 30 min Michael addition reaction between dual peptide modified PEG-MAL and PEG-SH crosslinker on acrylated cover glasses (diameter $\sim 14 \,\text{mm}$). After multiple PBS washes (>4 times for 5 min each to remove the unreacted groups), the as-prepared hydrogels were used to characterize mechanical properties or for cell experiments. Rho-RGD (rhodamine-labeled RGD peptide) and FITC-HAVDI (FITC-labeled HAVDI peptide) were used to characterize the distributions and concentrations of RGD or HAVDI peptides in hydrogels and to determinate their coupling efficiency by measuring the fluorescence spectroscopy at 588 nm and 520 nm, respectively. Briefly, the prepared PEG hydrogels incorporated with 1 mM peptides (Rho-RGD or FITC-HAVDI) were rinsed with PBS (> 4 times for 5 min each) to collect unbound peptides on a supernatant solution. The supernatant and the control solution (containing the initial peptide concentration of 1 mM) were both diluted with PBS to obtain the same volume. Their fluorescence emission intensity was measured to calculate the conjugation efficiency.

Mechanical characterization of hydrogels. Indentation experiments were performed to estimate the Young's moduli of hydrogels. Following standard procedures^{67–69}, Young's modulus was assessed from load-displacement curves obtained using a commercial nanoindenter (Piuma Nanoindenter, Optics11, Amsterdam, N.L.) with a microsphere indentation tip (diameter: 2.5 μm, stiffness: 0.28 N/m). Load-displacement curves (representative data are shown in Supplementary Fig. 3) were converted to load-indentation curves and fitted to the Hertz model, assuming a linear elastic and isotropic material response⁷⁰:

$$P = \frac{4}{3} \frac{E}{1 - v^2} R^{1/2} h^{3/2} \tag{1}$$

where *P* is the load on the hydrogel, *R* is the radius of the spherical tip, *h* is the indentation depth, and *E* and *v* are the Young's modulus and Poisson's ratio of the hydrogel, respectively. For isotropic materials, including PEG hydrogels, the compressive and tensile moduli often have the same amplitude, and vary together with changes in material parameters⁷¹. Thus, the Young's modulus obtained by localized indentation could reflect the substrate stiffness sensed by cells. For each

condition, the mean and standard error of mean were obtained from dozens of random points on 3 hydrogel replicates. We note that, unlike most ECM materials, which are hyperelastic and/or fibrous in character^{72–74}, the hydrogel used in this study was well fit by the Hertz model. Although this simplifies analysis, it is a limitation of the study and future work should address the role of ECM non-linearity on binding energetics and kinetics.

hMSC isolation. Human mesenchymal stem cells (hMSCs) were isolated from human bone marrow provided by commercial sources (Cyagen Biosciences). Briefly, cells were obtained from donors by bone marrow aspiration, then monocyte density centrifugation was performed and selected for adherent culture. Standard analytical methods were used to screen cell growth and differentiation into fat and bone.

Cell culture. Isolated hMSCs (labeled as P1) from human bone marrow were frozen down in protein-free cryopreservation medium (Cyagen, HUXMX-07021) and then used for all experiments in this manuscript. Growth medium (Cyagen, HUXMA-90011) was changed every 2-3 days. Hydrogels for cell culture were sterilized in 75% (v/v) aqueous ethanol for 3-4 h followed by five rinses with sterilized PBS as described⁷⁵. Prior to cell seeding, hydrogels were prewetted with growth medium for 30 min. hMSCs were seeded at low density (1000 cells per cm²) to avoid cell-cell interactions, except as noted. Sparse or confluent cells were seeded at 1000 or 20,000 cells per cm². For studies without mechanical dosing on TCP, hMSCs were directly seeded on soft hydrogels after cell thawing. For studies with mechanical dosing on TCP, hMSCs were seeded on TCP at cell density from 1000 to 20,000 cells per cm², depending on the culture time on TCP. For myosin inactivation studies, inhibition of myosin was achieved using 50 µM blebbistatin (Abcam, ab120425) for 30 min. For osteogenic differentiation studies, cells were cultured in an osteogenic medium (Cyagen, HUXMA-90021) to remove any confounding effect of chemical dosing and accelerate the process of osteogenic differentiation. For N-cadherin-blocking studies, 1 mM soluble HAVDI(-C) peptides (HAVDIGGG) were added to the growth media directly following hMSCs seeding, according to methods previously described^{39,76}. The soluble peptides designed to bind with the N-cadherin receptor on the cell membrane can avoid conjugating to the PEG-MAL backbone by removing cysteine in the sequence of original HAVDI peptides.

Immunostaining and quantification. hMSCs were fixed in 4% paraformaldehyde (formaldehyde solution: PBS = 1.9) for 20 min, followed by 10 min permeabilization with 0.5% Triton X-100 in PBS, and 30 min blocking non-specific binding sites with 5% bovine serum albumin (BSA) in PBS. Primary antibodies were diluted in 1% BSA in PBS and added overnight at 4 °C. Antibodies and dilutions used in this study contained anti-YAP (1:100, rabbit, Cell Signaling no. 14074), anti-βcatenin (1:200, mouse, Cell Signaling no. 2677), anti-N-cadherin (1:200, rabbit, Cell Signaling no. 13116), anti-RUNX2 (1:1600, rabbit, Cell Signaling no. 12556), anti-OCN (1:200, rabbit, Thermo Fisher no. PA5-96529). After three PBS rinses, AlexaFluor-488[H+L] secondary antibodies (1:500, goat anti-rabbit, Cell Signaling no. 4412) and AlexaFluor-647[H+L] secondary antibodies (1:500, goat antimouse, Cell Signaling no. 4410) were added for 2 h at room temperature, followed by F-actin staining using Rhodamine Phalloidin (1:1,000; Invitrogen no. R415) incubated for 30 min. All immunostained samples were embedded in ProLong® Gold Antifade Reagent with DAPI (Cell Signaling no. 8961) and visualized with Olympus FV3000 confocal microscope at 10 × 0.4NA (1.243 µm/pixel) and 60×1.42 NA (0.207 µm/pixel) oil immersion objective lenses. The amount of the N-cadherin and β -catenin in a region of mimetic or real cell-cell adhesion was quantified utilizing RGB Profiler plugin in Image J. Percentages of OCN positive cells were calculated by counting the number of OCN positive cells and then



dividing by the total number of cells based on DAPI staining. To exclude the data of adjacent cells with cell-cell interactions, only the immunostaining results of single cells having no contact with neighbors were counted for quantification in our study, except as noted the case of the confluent cells. Phosphatase Color Development Kit (Beyotime, C3206) following the manufacturer's instructions. Cell nuclei were then stained with DAPI to count the total cell numbers. Percentages of ALP positive cells were calculated by counting the number of blue-violet stained cells and then dividing by the total cell number.

ALP staining and quantification. hMSCs were fixed with 4% paraformaldehyde for 20 min, followed by washing with PBS, and stained with BCIP/NBT Alkaline

YAP and RUNX2 n/c ratio quantification. For sparse cells, the nucleus and cytoplasm were identified by F-actin and DAPI staining, and the n/c ratio R_{NC}^{sparse} for

Fig. 5 A modified motor-clutch model explains the role of HAVDI ligation in reversing YAP nuclear localization in MSCs. a In the motor-clutch model, integrin clutches connected to RGD on ECMs with binding rate (k_{on}), and broke with ECM at force dependent unbinding rate (k_{off}). Myosin motors pulled actin filaments with traction force (F_{trac}) at velocity (v_f). HAVDI binding (N-cadherin based adherens junctions) disturbed integrin clustering and decreased k_{on} in integrin binding to RGD on ECMs. Decreased k_{on} reduced the F_{trac} in actin filaments, and hence deformation of the viscoelastic nucleus (spring stiffness E_N and viscosity η_N). **b** The model for variation of k_{on} with ECM stiffness (E_{sub}) on HAVDI/RGD (H/R) and Scram/RGD (S/R) substrates. c Traction on H/R or S/R substrates with different stiffness E_{subr} , showing that H/R increased the stiffness threshold for generating elevated traction. Symbols are measured from experiments (mean ± s.e.m. from Supplementary Fig. 13b), while lines are modeling results. d In the force-dependent YAP redistribution model, elevated traction resulted in increased nuclear deformation, enlarged nuclear pores, increased YAP import rate, and thus higher YAP n/c ratio ($R_{\rm Nc}$) on HAVDI/RGD substrates than on Scram/RGD substrates. **e** The relationship between nuclear flattening ($\lambda_{\rm N}$) and actin contraction. Symbols are measured from experiments (mean ± s.e.m. from Supplementary Fig. 14b), while lines are modeling results. **f** R_{NC} increased linearly with nuclear flattening for all culture conditions. The line is prediction by our model. Hollow squares are data from reference³¹. The values of solid symbols on xaxis (λ_N) are from Supplementary Fig. 14b. The values of solid symbols on y-axis (R_{NC}) are from Fig. 2f and Fig. 3c-e. The lateral and vertical error bars indicate s.e.m. Results indicated that R_{NC} is an indicator of nuclear deformation. g Validation of the model for cells cultured on substrates of different stiffness. The model reproduced the di-sigmoidal curves in data from S/R and H/R groups (3 d for culture time). The values of dots on x-axis (stiffness) are from Fig. 1c, The values of dots on y-axis (R_{NC}) are from Fig. 2f. The lateral and vertical error bars indicate s.e.m. h An explanation of mechanical memory in cells transferred from TCP (dark purple) to S/R (orange) or to H/R (blue) substrates, denoted TCP-S/R or TCP-H/R, respectively. R_{NC} increased with culture time due to plastic deformation of the nucleus. Differences between TCP-S/R and TCP-H/R groups could be attributed to the differences in elastic recovery of the nucleus modulated by N-cadherins. Source data are provided as a Source Data file.

YAP or RUNX2 was calculated following techniques used by others^{21,77-79} as the ratio of the total fluorescence intensity in the nucleus, $I_{nucleus}$, to the total fluorescence in the remainder of the cell, weighted by the areas of the nucleus and the remainder of the cell:

$$R_{NC}^{sparse} = \frac{(I_{nucleus}/A_{nucleus})}{(I_{cell} - I_{nucleus})/(A_{cell} - A_{nucleus})}$$
(2)

where $A_{nucleus}$ is the area of the nucleus as measured by DAPI staining, A_{cell} is the overall area of the cell as delineated by F-actin staining, and I_{cell} is the total fluorescence intensity in the overall cell. Intensities and areas were measured using Image J (1.52p). Images of cells with saturated fluorescence were excluded.

For confluent cells, a multicellular zone of cells contacting with neighbors was delineated, and the above procedures were repeated to obtain the average YAP n/c ratio, $R_{nc}^{confluent}$, over the region of confluent cells:

$$\mathbf{R}_{NC}^{\text{confluent}} = \frac{\left(\sum_{i=1}^{N} I_{nucleus}^{i}\right) / \left(\sum_{i=1}^{N} A_{nucleus}^{i}\right)}{\left(I_{zone} - \sum_{i=1}^{N} I_{nucleus}^{i}\right) / \left(A_{zone} - \sum_{i=1}^{N} A_{nucleus}^{i}\right)}$$
(3)

where $A^i_{nucleus}$ is the area of the nucleus *i* in the zone containing *N* nuclei, $I^i_{nucleus}$ is the total fluorescence of nucleus *i*, I_{zone} is the total fluorescence intensity of the zone, and A_{zone} is the area of the zone.

Nuclear deformation analysis. z-stacks of 0.5 µm steps were captured, nuclear x-y projections (major and minor axis of nucleus) and x-z projections were reconstructed using Bitplane Imaris (7.2.3) software on the DAPI channel to measure the nuclear length (major axis) and nuclear height, respectively. Nuclear flattening was calculated as the ratio of nuclear length to height³¹.

Implementation of motor-clutch model. The model was modified from a wellestablished stochastic motor-clutch model^{56–58,60}. Briefly, the model considered the connection between actin filament and substrate was realized through n_c clutches (focal adhesion complex, including integrin and adapter proteins). n_m myosin molecules with stall force (F_m) pulled the actin filament at a retrograde velocity v_u . The clutches broke and reconnected according to characteristic on and off rates (k_{on} and k_{off}). k_{on} was dependent upon the integrin density on the cell membrane, which changed according to the conformation (folding or unfolding) of the adapter protein talin. Previous studies have shown that k_{on} grew with increasing substrate stiffness $(E_{sub})^{60}$. Here, the relationship between k_{on} and HAVDI presentation was modeled using Arrhenius function. Simulation ran for 10⁵ time steps (>1000 s) to ensure the reaching of a steady state. Details of the model can be found in Supplementary Methods and Supplementary Table 1. The calculation of the model is conducted by a custom code⁸⁰.

Statistical analysis. All data for cell experiments were collected using a single cell line studied on at least three hydrogel replicates per condition, except where noted. The number of cells counted for each condition was indicated in each figure legend. Statistical comparisons were performed with Graphpad Prism (8.0.1) or Origin (2020) using one-way analysis of variance (ANOVA) with Tukey's post hoc test for comparison of multiple groups. Differences were considered to be significant when *p* values were below 0.05. Details of sample sizes and significance levels were given in figure legends. In all figures, data were shown as mean \pm standard error of the mean (s.e.m.) unless otherwise stated.

Reporting summary. Further information on research design is available in the Nature Research Reporting Summary linked to this article.

Data availability

Source data of the Figs. 1c, 2f, 3c-e, 4c, 4e, 4g, 5b, 5c, 5e, 5g, 5h; Supplementary Fig. 4, Supplementary Fig. 5, Supplementary Fig. 6b, Supplementary Fig. 7b, Supplementary Fig. 8b, Supplementary Fig. 1c, Supplementary Fig. 10b, Supplementary Fig. 11, Supplementary Fig. 12b, Supplementary Fig. 13b, Supplementary Fig. 14b-e are provided with this paper. All other relevant data supporting the key findings of this study are available within the article and its Supplementary Information files or from the corresponding author upon reasonable request. Source data are provided with this paper.

Code availability

Source code for motor-clutch model is available for download at https://github.com/ zhuhy2021/Motor-clutch-model-including-HAVDI-effect (https://doi.org/10.5281/ zenodo.5537041)⁸⁰.

Received: 6 November 2020; Accepted: 1 October 2021; Published online: 28 October 2021

References

- Engler, A. J., Sen, S., Sweeney, H. L. & Discher, D. E. Matrix elasticity directs stem cell lineage specification. *Cell* 126, 677–689 (2006).
- Frith, J. E. et al. Mechanically-sensitive miRNAs bias human mesenchymal stem cell fate via mTOR signalling. *Nat. Commun.* 9, 257 (2018).
- Liu, L. et al. Mechanoresponsive stem cells to target cancer metastases through biophysical cues. Sci. Transl. Med 9, eaan2966 (2017).
- Chaudhuri, O. et al. Hydrogels with tunable stress relaxation regulate stem cell fate and activity. *Nat. Mater.* 15, 326–334 (2015).
- Vining, K. H. & Mooney, D. J. Mechanical forces direct stem cell behaviour in development and regeneration. *Nat. Rev. Mol. Cell Bio* 18, 728 (2017).
- Griffin, D. R., Weaver, W. M., Scumpia, P. O., Di Carlo, D. & Segura, T. Accelerated wound healing by injectable microporous gel scaffolds assembled from annealed building blocks. *Nat. Mater.* 14, 737–744 (2015).
- Chaudhuri, P. K., Low, B. C. & Lim, C. T. Mechanobiology of tumor growth. Chem. Rev. 118, 6499–6515 (2018).
- Trounson, A. & McDonald, C. Stem cell therapies in clinical trials: progress and challenges. *Cell Stem Cell* 17, 11–22 (2015).
- Miao, C., Lei, M., Hu, W., Han, S. & Wang, Q. A brief review: the therapeutic potential of bone marrow mesenchymal stem cells in myocardial infarction. *Stem Cell Res. Ther.* 8, 242 (2017).
- Madl, C. M., Heilshorn, S. C. & Blau, H. M. Bioengineering strategies to accelerate stem cell therapeutics. *Nature* 557, 335–342 (2018).
- 11. Yang, C., Tibbitt, M. W., Basta, L. & Anseth, K. S. Mechanical memory and dosing influence stem cell fate. *Nat. Mater.* **13**, 645–652 (2014).
- Panciera, T., Azzolin, L., Cordenonsi, M. & Piccolo, S. Mechanobiology of YAP and TAZ in physiology and disease. *Nat. Rev. Mol. Cell Bio* 18, 758 (2017).

ARTICLE

- Halder, G., Dupont, S. & Piccolo, S. Transduction of mechanical and cytoskeletal cues by YAP and TAZ. *Nat. Rev. Mol. Cell Bio* 13, 591–600 (2012).
- Totaro, A., Panciera, T. & Piccolo, S. YAP/TAZ upstream signals and downstream responses. *Nat. Cell Biol.* 20, 888–899 (2018).
- Aragona, M. et al. A mechanical checkpoint controls multicellular growth through YAP/TAZ regulation by actin-processing factors. *Cell* 154, 1047–1059 (2013).
- Driscoll, TristanP., Cosgrove, BrianD., Heo, S.-J., Shurden, ZachE. & Mauck, RobertL. Cytoskeletal to nuclear strain transfer regulates YAP signaling in mesenchymal stem cells. *Biophys. J.* 108, 2783–2793 (2015).
- Zhong, W. et al. Mesenchymal stem cell and chondrocyte fates in a multishear microdevice are regulated by yes-associated protein. *Stem Cells Dev.* 22, 2083–2093 (2013).
- Dupont, S. et al. Role of YAP/TAZ in mechanotransduction. *Nature* 474, 179 (2011).
- Tang, Y. et al. MT1-MMP-dependent control of skeletal stem cell commitment via a β1-integrin/YAP/TAZ signaling axis. *Dev. Cell* 25, 402–416 (2013).
- Chen, Z., Luo, Q., Lin, C., Kuang, D. & Song, G. Simulated microgravity inhibits osteogenic differentiation of mesenchymal stem cells via depolymerizing F-actin to impede TAZ nuclear translocation. *Sci. Rep.* 6, 30322 (2016).
- Killaars, A. R. et al. Extended exposure to stiff microenvironments leads to persistent chromatin remodeling in human mesenchymal stem cells. *Adv. Sci.* 6, 1801483 (2019).
- 22. Li, C. X. et al. MicroRNA-21 preserves the fibrotic mechanical memory of mesenchymal stem cells. *Nat. Mater.* **16**, 379 (2016).
- Ladoux, B. & Mège, R.-M. Mechanobiology of collective cell behaviours. Nat. Rev. Mol. Cell Bio 18, 743 (2017).
- Hsiao, C. et al. Human pluripotent stem cell culture density modulates YAP signaling. *Biotechnol. J.* 11, 662–675 (2016).
- 25. Totaro, A. et al. YAP/TAZ link cell mechanics to notch signalling to control epidermal stem cell fate. *Nat. Commun.* **8**, 15206 (2017).
- Bosch-Fortea, M. & Martín-Belmonte, F. Mechanosensitive adhesion complexes in epithelial architecture and cancer onset. *Curr. Opin. Cell Biol.* 50, 42–49 (2018).
- Han, M. K. L. & de Rooij, J. Converging and unique mechanisms of mechanotransduction at adhesion sites. *Trends Cell Biol.* 26, 612–623 (2016).
- Mui, K. L., Chen, C. S. & Assoian, R. K. The mechanical regulation of integrin–cadherin crosstalk organizes cells, signaling and forces. *J. Cell Sci.* 129, 1093 (2016).
- Petridou, N. I., Spiró, Z. & Heisenberg, C.-P. Multiscale force sensing in development. *Nat. Cell Biol.* 19, 581–588 (2017).
- Tajik, A. et al. Transcription upregulation via force-induced direct stretching of chromatin. *Nat. Mater.* 15, 1287–1296 (2016).
- Elosegui-Artola, A. et al. Force triggers YAP nuclear entry by regulating transport across nuclear pores. *Cell* 171, 1397–1410 (2017).
- 32. De Pascalis, C. & Etienne-Manneville, S. Single and collective cell migration: the mechanics of adhesions. *Mol. Biol. Cell* **28**, 1833–1846 (2017).
- Seong, J. et al. Distinct biophysical mechanisms of focal adhesion kinase mechanoactivation by different extracellular matrix proteins. *Proc. Natl Acad. Sci. USA* 110, 19372–19377 (2013).
- Kechagia, J. Z., Ivaska, J. & Roca-Cusachs, P. Integrins as biomechanical sensors of the microenvironment. Nat. Rev. Mol. Cell Bio 20, 457–473 (2019).
- Fraley, S. I. et al. A distinctive role for focal adhesion proteins in threedimensional cell motility. *Nat. Cell Biol.* 12, 598–604 (2010).
- Pulous, F. E., Grimsley-Myers, C. M., Kansal, S., Kowalczyk, A. P. & Petrich, B. G. Talin-dependent integrin activation regulates VE-cadherin localization and endothelial cell barrier function. *Circulation Res.* **124**, 891–903 (2019).
- Yamamoto, H. et al. Integrin β1 controls VE-cadherin localization and blood vessel stability. Nat. Commun. 6, 6429 (2015).
- Bertocchi, C. et al. Nanoscale architecture of cadherin-based cell adhesions. Nat. Cell Biol. 19, 28–37 (2017).
- Cosgrove, B. D. et al. N-cadherin adhesive interactions modulate matrix mechanosensing and fate commitment of mesenchymal stem cells. *Nat. Mater.* 15, 1297 (2016).
- 40. Dalby, M. J., García, A. J. & Salmeron-Sanchez, M. Receptor control in mesenchymal stem cell engineering. *Nat. Rev. Mater.* **3**, 17091 (2018).
- Zhu, H. et al. The relationship between thiol-acrylate photopolymerization kinetics and hydrogel mechanics: an improved model incorporating photobleaching and thiol-Michael addition. *J. Mech. Behav. Biomed.* 88, 160–169 (2018).
- Truong Quang, B.-A., Mani, M., Markova, O., Lecuit, T. & Lenne, P.-F. Principles of E-cadherin supramolecular organization In vivo. *Curr. Biol.* 23, 2197–2207 (2013).
- Rape A. D., Zibinsky M., Murthy N., Kumar S. A synthetic hydrogel for the high-throughput study of cell-ECM interactions. *Nat. Commun.* 6, (2015).

- 44. Wei, Q. et al. BMP-2 signaling and mechanotransduction synergize to drive osteogenic differentiation via YAP/TAZ. Adv. Sci. 7, 1902931 (2020).
- Labernadie, A. et al. A mechanically active heterotypic E-cadherin/N-cadherin adhesion enables fibroblasts to drive cancer cell invasion. *Nat. Cell Biol.* 19, 224–237 (2017).
- Pasapera, AnaM. et al. Rac1-dependent phosphorylation and focal adhesion recruitment of myosin IIA regulates migration and mechanosensing. *Curr. Biol.* 25, 175–186 (2015).
- Guvendiren, M. & Burdick, J. A. Stiffening hydrogels to probe short-and longterm cellular responses to dynamic mechanics. *Nat. Commun.* 3, 792 (2012).
- Paknikar, A. K., Eltzner, B. & Köster, S. Direct characterization of cytoskeletal reorganization during blood platelet spreading. *Prog. Biophys. Mol. Biol.* 144, 166–176 (2019).
- Sunyer, R. et al. Collective cell durotaxis emerges from long-range intercellular force transmission. *Science* 353, 1157–1161 (2016).
- 50. Hou, Y. et al. Surface roughness and substrate stiffness synergize to drive cellular mechanoresponse. *Nano Lett.* **20**, 748–757 (2020).
- 51. Cui, Y. et al. Cyclic stretching of soft substrates induces spreading and growth. *Nat. Commun.* **6**, 6333 (2015).
- Valenti, M. T., Dalle Carbonare, L. & Mottes, M. Osteogenic differentiation in healthy and pathological conditions. *Int J. Mol. Sci.* 18, 41 (2017).
- Shen, W.-C. et al. Methylation and PTEN activation in dental pulp mesenchymal stem cells promotes osteogenesis and reduces oncogenesis. *Nat. Commun.* 10, 2226 (2019).
- Elosegui-Artola, A., Trepat, X. & Roca-Cusachs, P. Control of mechanotransduction by molecular clutch dynamics. *Trends Cell Biol.* 28, 356–367 (2018).
- Case, L. B. & Waterman, C. M. Integration of actin dynamics and cell adhesion by a three-dimensional, mechanosensitive molecular clutch. *Nat. Cell Biol.* 17, 955–963 (2015).
- Chan, C. E. & Odde, D. J. Traction dynamics of filopodia on compliant substrates. *Science* 322, 1687–1691 (2008).
- Elosegui-Artola, A. et al. Rigidity sensing and adaptation through regulation of integrin types. *Nat. Mater.* 13, 631–637 (2014).
- Elosegui-Artola, A. et al. Mechanical regulation of a molecular clutch defines force transmission and transduction in response to matrix rigidity. *Nat. Cell Biol.* 18, 540 (2016).
- Dasgupta, I. & McCollum, D. Control of cellular responses to mechanical cues through YAP/TAZ regulation. J. Biol. Chem. 294, 17693–17706 (2019).
- Oria, R. et al. Force loading explains spatial sensing of ligands by cells. *Nature* 552, 219–224 (2017).
- McEvoy, E., Deshpande, V. S. & McGarry, P. Transient active force generation and stress fibre remodelling in cells under cyclic loading. *Biomech. Model Mechanobiol.* 18, 921–937 (2019).
- 62. Sears, C. & Kaunas, R. The many ways adherent cells respond to applied stretch. J. Biomech. 49, 1347–1354 (2016).
- Elson, E. L. & Genin, G. M. The role of mechanics in actin stress fiber kinetics. Exp. Cell Res 319, 2490–2500 (2013).
- Kim, J.-K. et al. Nuclear lamin A/C harnesses the perinuclear apical actin cables to protect nuclear morphology. *Nat. Commun.* 8, 2123 (2017).
- 65. Swift, J. et al. Nuclear lamin-A scales with tissue stiffness and enhances matrix-directed differentiation. *Science* **341**, 975 (2013).
- Pajerowski, J. D., Dahl, K. N., Zhong, F. L., Sammak, P. J. & Discher, D. E. Physical plasticity of the nucleus in stem cell differentiation. *Proc. Natl Acad. Sci. USA* 104, 15619–15624 (2007).
- Oyen, M. L. Mechanical characterisation of hydrogel materials. *Int. Mater. Rev.* 59, 44–59 (2014).
- Zhu, H. et al. Modeling the mechanics, kinetics, and network evolution of photopolymerized hydrogels. J. Mech. Phys. Solids 142, 104041 (2020).
- Yue, L., Wang, S., Wulf, V. & Willner, I. Stiffness-switchable DNA-based constitutional dynamic network hydrogels for self-healing and matrix-guided controlled chemical processes. *Nat. Commun.* 10, 4774 (2019).
- Amann, E., Wolff, P., Breel, E., van Griensven, M. & Balmayor, E. R. Hyaluronic acid facilitates chondrogenesis and matrix deposition of human adipose derived mesenchymal stem cells and human chondrocytes cocultures. *Acta Biomater.* 52, 130–144 (2017).
- Nguyen, Q. T., Hwang, Y., Chen, A. C., Varghese, S. & Sah, R. L. Cartilage-like mechanical properties of poly (ethylene glycol)-diacrylate hydrogels. *Biomaterials* 33, 6682–6690 (2012).
- Dowling, E. P., Ronan, W. & McGarry, J. P. Computational investigation of in situ chondrocyte deformation and actin cytoskeleton remodelling under physiological loading. *Acta Biomater.* 9, 5943–5955 (2013).
- Hall, M. S. et al. Fibrous nonlinear elasticity enables positive mechanical feedback between cells and ECMs. *Proc. Natl Acad. Sci. USA* 113, 14043–14048 (2016).
- 74. Shakiba, D. et al. The balance between actomyosin contractility and microtubule polymerization regulates hierarchical protrusions that govern efficient fibroblast-collagen interactions. *ACS Nano* **14**, 7868–7879 (2020).

- Ding, B. et al. Tough and cell-compatible chitosan physical hydrogels for mouse bone mesenchymal stem cells in vitro. ACS Appl. Mater. Int. 8, 19739–19746 (2016).
- 76. Madl, C. M. et al. Maintenance of neural progenitor cell stemness in 3D hydrogels requires matrix remodelling. *Nat. Mater.* **16**, 1233–1242 (2017).
- Killaars, A. R., Walker, C. J. & Anseth, K. S. Nuclear mechanosensing controls MSC osteogenic potential through HDAC epigenetic remodeling. *Proc. Natl Acad. Sci. USA* 117, 21258–21266 (2020).
- Nardone, G. et al. YAP regulates cell mechanics by controlling focal adhesion assembly. *Nat. Commun.* 8, 15321 (2017).
- 79. Chronopoulos, A. et al. Syndecan-4 tunes cell mechanics by activating the kindlin-integrin-RhoA pathway. *Nat. Mater.* **19**, 669–678 (2020).
- Zhang C., et al. Mechanics-driven nuclear localization of YAP can be reversed by N-cadherin ligation in mesenchymal stem cells, https://doi.org/10.5281/ zenodo.5537041 (2021).

Acknowledgements

This work was supported by the National Natural Science Foundation of China (12022206, 11772253), the Shaanxi Province Youth Talent Support Program, the Key Research and Development Program of Shaanxi Province (2021SF-061), the Young Talent Support Plan of Xi'an Jiaotong University, the Foundation of Xi'an Medical University (2018XNRC06) and the National Institutes of Health (R01AR077793). We thank Miss Hao at Instrument Analysis Center of Xi'an Jiaotong University for their assistance with CLSM analysis.

Author contributions

C.Z., H.Y.Z., M.L. and G.M.G. designed the study, in consultation with F.X., B.C., S.B.L., Y.L., H.H.W., H.G. and T.J.L; C.Z., H.Y.Z., X.R.R., B.G., Z.Z., Z.Q.L., B.C., S.B.L. B.Y.S performed the experiments, modeling, collected and analyzed the data. C.Z., H.Y.Z., M.L., G.M.G., T.J.L., F.X., Y.L., H.H.W. and H.G. prepared the manuscript. All authors discussed the experiments, modeling, read and commented on the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41467-021-26454-x.

Correspondence and requests for materials should be addressed to Min Lin.

Peer review information *Nature Communications* thanks Matthew Dalby and the other anonymous reviewer(s) for their contribution to the peer review this work.

Reprints and permission information is available at http://www.nature.com/reprints

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons.org/ licenses/by/4.0/.

© The Author(s) 2021