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# Contractility of striated muscle tissue increases with environmental stiffness according to a power-law relationship

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The interplay between contractility and mechanosensing in striated muscle is important for tissue morphogenesis, load adaptation, and disease progression, but remains poorly understood. Here, we investigate how contractile force generation in neonatal rat cardiac and C2C12 mouse skeletal muscle micro-tissues depends on environmental stiffness. Micro-tissues self-assemble and mature over one week between flexible elastic pillars with adjustable stiffness that we vary over three orders of magnitude. Contractile forces are measured from pillar deflections and are decomposed into static baseline and transient active forces in response to electrical stimulation. After 3–5 days of maturation, we find that the active, but not static, force of both cardiac and skeletal micro-tissues increases with environmental stiffness according to a strong power-law relationship, indicating a pronounced mechanoresponsiveness. Depleting the focal adhesion protein  $\beta$ -parvin in skeletal muscle miscro-tissues reduces absolute contractile force but does not affect mechanoresponsiveness. Our findings highlight the influence of external stiffness in striated muscle during development.

The mechanical properties of the microenvironment are critical for cell and tissue morphogenesis, homeostasis, regeneration, and disease progression<sup>1,2</sup>. Striated muscle in particular is well known to respond sensitively to the mechanical environment<sup>3,4</sup>. For example, the heart adapts its stroke volume to the hemodynamic load according to the Frank–Starling mechanism<sup>5</sup>, and shows hypertrophic responses to long-term increases in load<sup>6,7</sup>. Similarly, skeletal muscles increase their maximum contractile force by long-term training under isometric conditions<sup>8</sup>, but develop atrophy under reduced mechanical load e.g. under microgravity conditions in space<sup>9</sup>.

During embryonic development, striated muscle tissue forms preferentially along mechanical stiffness gradients<sup>10</sup>. A related effect can also be observed in vitro: micro-tissues that are formed between two flexible cantilevers increase their contractile force with increasing cantilever stiffness<sup>10,11</sup>. The molecular basis of the underlying mechanosensing and mechanochemical transduction processes, however, are still poorly understood. This is partly due to the difficulty to impose defined loading conditions to muscle cells and tissue grown in traditional two-dimensional (2-D) cell culture systems. Moreover, 2-D muscle cannot replicate the threedimensional (3-D) adhesive microenvironment of native muscle tissue with its specialized cellular mechanosensing structures such as costameres and intercalated disks<sup>12,13</sup>.

The distinctive feature of striated muscle compared to other cell types is the ability to actively contract in response to electrical stimulation. At the molecular level, muscle contraction results from the interaction of sarcomeric actin and myosin. The sarcomeres are laterally coupled to the extracellular matrix (ECM) via costameres. The transmembrane force coupling to the ECM is established in large part through integrins. Intracellularly, integrins form an adhesion complex consisting of talin, vinculin, and numerous other focal adhesion proteins that in turn connect to the cytoskeleton. Most of the focal adhesion proteins, including integrins themselves, have been implicated in mechanochemical signaling<sup>14,15</sup>. Recently, we have shown that a critical mechanoresponsive signaling hub in cardiac muscle is the focal adhesion protein  $\beta$ -parvin<sup>16</sup>. In neonatal rat ventricular cardiomyocytes,  $\beta$ -parvin connects to integrins via integrin-linked kinase and activates Rac1 in response to mechanical load, thereby controlling cell shape, sarcomere assembly, and contractility. Since β-parvin is also highly expressed in skeletal muscle tissue, we hypothesize that it may have mechanoregulatory properties in skeletal muscle similar to those in cardiac muscle.

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Here, we use in vitro engineered muscle micro-tissues of cardiac or skeletal origin to study how the developing muscle responds to the external stiffness of the microenvironment. In our study, muscle micro-tissues are formed between two elastic polydimethylsiloxane (PDMS) pillars with an effective spring constant that can be adjusted over three orders of magnitude. We find that the active contractile forces of cardiac and skeletal muscle micro-tissues strongly respond to the spring constant of the pillars. In particular, the electrically stimulated contractile force increases with higher pillar stiffness according to a power-law relationship, with power-law exponents between 0.3 and 1.0 depending on cell type and time in culture. We furthermore show that this mechanoadaptation is independent of absolute contractility, as skeletal micro-tissues with a  $\beta$ -parvin knockdown exhibit dramatically reduced active and static forces and contraction velocity compared to control siRNA micro-tissues, but still show a similar power-law relationship between active force and environmental stiffness.

#### Results

# Micro-tissues as a model for structural and functional maturation of skeletal muscle

To study the mechanoresponsiveness of skeletal muscle to environmental stiffness during maturation, we generated muscle micro-tissues that formed between two flexible pillars with adjustable spring constant. In total, 5000 C2C12 skeletal muscle cells were suspended in 6  $\mu$ l of unpolymerized collagen-I/Matrigel solution and added to polydimethylsiloxane (PDMS) chambers containing two flexible pillars (0.5 mm diameter, placed 2 mm apart) (Fig. 1A). Upon matrix polymerization, the cells adhered to the matrix fibers and exerted contractile forces, resulting in matrix remodeling and the formation of a micro-tissue within 24 h (Fig. 1B, Supplementary Fig. 1, Supplementary Fig. 2). The

height at which the micro-tissues attach between the pillars was tuned by forming a first layer of cell-free matrix at the bottom of the PDMS chamber with a defined volume and allowing it to polymerize for one hour prior to cell seeding in a second collagen layer on top of the bottom layer. After 24 h, we replaced the culture medium with a differentiation medium, supplemented with 0.5% horse serum and 0.5% ITS (insulin, transferrin, and selenium), to initiate myocyte differentiation.

Over the following days, the myocytes started to exert measurable forces on the pillars, causing further matrix compaction and fiber alignment between the pillars (Fig. 1A, B). Over the course of seven days of differentiation, the myocytes elongated and aligned between the pillars. In addition, they showed increasing expression levels of the muscle differentiation markers  $\alpha$ -actinin and the intermediate filament desmin, as revealed by immunofluorescence staining (Fig. 1C, D).

Already 1 day after cell seeding, the collective contractile forces exerted by the myocytes caused the micro-tissues to pull on the pillars, resulting in a pillar deflection that was visible with bright-field imaging. After 4 days of differentiation culture, the muscle tissues started to respond to electrical pacing, as seen by a measurable pillar deflection with every pulse. The force acting on the pillars was then calculated according to Hooke's law (Eq. (1)) from the pillar deflection (Fig. 2a, b) multiplied by the pillar spring constant (Fig. 2c). We refer to the continuous baseline force as the *static force*, and we refer to the additional force above the static force that is observed in response to electrical stimulation as the *active force* (Fig. 2d).

The static force of C2C12 micro-tissues increased over time in differentiation culture. In PDMS devices of intermediate stiffness (pillar spring constant ~6 N/m), the static force reached 76  $\mu$ N on average after 1 week, and the active force was 7.5  $\mu$ N (Fig. 2e, f). By contrast, undifferentiated C2C12 micro-tissues that were continuously exposed to culture medium but



**Fig. 1** | **Formation and maturation of micro-tissues generated from C2C12 cells. A** Schematic of the experimental protocol for micro-tissues fabrication. In a two-step process, we pipette a layer of cells mixed in an unpolymerized collagen/Matrigel matrix into the PDMS well on top of a pre-polymerized bottom layer without cells. Within 24 h, micro-tissues form in a cell culture medium containing 15% FCS, and we subsequently switch to a differentiation medium containing 0.5% HS and 0.5% ITS for the remainder of the experiment. **B** Bright-field images of a micro-tissue over several days in culture. Scale bar: 500 μm. **C** Maximum intensity projections of confocal image stacks of micro-

tissues fixed at 0, 1, 3, and 7 days after switching to differentiation medium. Tissues are stained for  $\alpha$ -actinin, desmin, and nuclei (DRAQ5). Excitation intensities and detector gains were the same for all samples. The gradual increase in  $\alpha$ -actinin and desmin intensities over time demonstrate maturation of the myocytes in culture. Scale bar: 200  $\mu$ m. **D** Maximum intensity projections of confocal image stacks over the entire length of a micro-tissue (fixed on day 7) stained as before. The close-up images show parallel orientation of the myocytes along the axis connecting the pillars. Scale bar: 200  $\mu$ m. Scale bar in close-up: 100  $\mu$ m.

Fig. 2 | Contractile forces in C2C12 micro-tissues. a Bright-field image of a C2C12 micro-tissue focused at the top of the PDMS pillars. The orange arrowhead indicates a high-contrast point that is used for particle image velocimetry analysis. Scale bar: 200 µm. b Kymograph of the region indicated in (a) in response to active tissue contraction. Scale bars: 10 µm and 250 ms. c Calibration curves to determine the spring constants of the PDMS pillar. The spring constants were measured from the forcedeflection relationship of pillars at different heights and for PDMS with different crosslinker-to-base ratios. Dots represent slopes of individual forcedeflection measurements, and lines represent fits to the data points using the Euler-Bernoulli beam equation. d Static and active contractility of the micro-tissue shown in (a). The stimulation frequency was 1 Hz. e Static contractile forces of C2C12 micro-tissues after 7 days in culture. One group of micro-tissues was prepared as usual (i.e., using ITS differentiation medium), and one group was kept in culture medium for the entire 7 days (instead of switching to ITS medium after 24 h) so that the myocytes did not differentiate. We measured the static contractile forces under control conditions (Ctrl; 1 vol% dimethylsulfoxid), after adding either 10 µM cytochalasin-D (cyto-D), or 100 µM blebbistatin (Blebb) to the medium for 1 h, or after adding Triton X-100 (Tx-100) to the medium for 10 min; n.s.,  $P \ge 0.05$ ;  $\star \star \star$ , P < 0.001. f Same as (e) for active contractile forces. g Contrast-enhanced brightfield images of exemplary micro-tissues before and after treatment with cyto-D. One micro-tissue was cultured in ITS medium and the other in culture medium before drug treatment. Scale bar: 100 µm.



not differentiation medium showed higher static forces ( $166 \mu$ N on average), but almost no measurable active forces ( $0.9 \mu$ N on average).

To further explore the origins of static and active contractility, we measured forces after treatment with inhibitors for different components of the contractile machinery (Fig. 2e, f). Addition of 100 µM of the myosin II inhibitor blebbistatin for one hour completely impaired active contractility in all micro-tissues (active forces were less than 0.1 µN, resulting solely from noise in the pillar deflection measurements). Cell permeabilization with Triton X-100 at a concentration of 0.5% for ten minutes also completely impaired active contractility, confirming that an intact sarcolemma is essential for initiating contractions through electrical stimulation. By contrast, static forces were not completely abolished but strongly reduced following blebbistatin and Triton X-100 treatment. In undifferentiated tissues, static forces fell from 166 µN to 27 µN (blebbistatin) and 24 µN (Triton X-100), and in differentiated tissues, static forces fell from 76  $\mu$ N to 14  $\mu$ N (blebbistatin) and 16 µN (Triton X-100). These findings are consistent with the requirement of myosin II activity for contractile force generation in nonmuscle cells<sup>17</sup>.

Since sarcomeric actin filaments are stably capped at their barbed ends in the Z-disks of myofibers<sup>18,19</sup>, we hypothesized that the active forces in differentiated C2C12 muscle-micro-tissues are less susceptible to barbedend depolymerization than the static forces. To test this, we treated differentiated and undifferentiated micro-tissues with high doses of the F-actin barbed-end depolymerizing fungal toxin cytochalasin D (cyto-D). Treatment with 10  $\mu$ M cyto-D for one hour reduced the static forces in differentiated and undifferentiated micro-tissues to similar levels as seen after treatment with blebbistatin or Triton-X (26  $\mu$ N in differentiated and 32  $\mu$ N in undifferentiated micro-tissues). By contrast, cyto-D treatment had no influence on active contractile forces in differentiated micro-tissues (7.1  $\mu$ N). In addition, brightfield imaging revealed that after treatment with cyto-D, undifferentiated micro-tissues increased in width, and many cells appeared rounded (Fig. 2g), whereas tissue widening and cell rounding were less pronounced in differentiated micro-tissues. The observation that cyto-D has an inhibitory effect only on static but not on active forces strongly supports our hypothesis that active forces are generated predominantly by differentiated cells where the barbed ends of sarcomeric actin filaments are stably capped, rendering the cells insensitive to cyto-D treatment, while cyto-D can initiate barbed-end depolymerization of the non-sarcomeric F-actin in undifferentiated myocyte precursors, resulting in reduced static forces. The presence of appreciable static forces after treatments with cyto-D, blebbistatin, and Triton X-100 furthermore suggests that a part of the static force originates from stored mechanical tension within remodeled collagen fibers.

Next, we sought to understand the role of integrin-type adhesions to the ECM in the maturation of the micro-tissues. The differentiation of myoblasts into myotubes requires the engagement of integrins or the dystrophin-glycoprotein complex to laminin, a critical adhesive component of the extracellular matrix surrounding skeletal myofibers and cardiac myocytes<sup>20–27</sup>. Since laminin is a major component of Matrigel<sup>28</sup>, we tested whether the presence of Matrigel was required for proper C2C12-microtissue formation and contraction. C2C12 cells mixed into pure collagen-I (COL), without the addition of Matrigel, did not develop uniformlycompact micro-tissues but over the course of 7 days only formed loose tissues interspersed with denser aggregates (Fig. 3A). Importantly, these micro-tissues were unable to generate active contractile forces (Fig. 3B). These results suggest that laminin promoted C2C12-myoblast differentiation in micro-tissues, in line with our previous results that active contractility requires differentiated cells. Fig. 3 | Laminin is a critical component for C2C12 micro-tissue compaction and maturation. A Bright-field images of representative microtissues for all conditions. Scale bar: 500 µm. **B** Active contractile forces of C2C12 micro-tissues prepared with ECMs of different compositions: collagen only (COL), collagen and 1 mg/ml Matrigel (COL + MA), collagen and 1 mg/ml growth factor-reduced Matrigel (COL + MA.gf), collagen and 100 µg/ml laminin (COL + LAM<sub>100</sub>), and collagen and 200 µg/ ml laminin (COL + LAM<sub>200</sub>); n.s.,  $P \ge 0.05$ ;  $\star \star \star$ , P < 0.001.



To test whether the impaired muscle differentiation in the absence of Matrigel was indeed due to a lack of laminin, or due to the lack of growth factors that are also part of Matrigel, we compared C2C12 micro-tissues with collagen-I containing 1 mg/ml of either regular (COL + MA) or growth factor-reduced Matrigel (COL + MA-gf), or 100 µg/ml (COL + LAM\_{100}), or 200  $\mu g/ml$  (COL + LAM\_{200}) pure laminin isolated from Engelbreth-Holm-Swarm murine sarcoma basement membrane. Micro-tissues formed in the presence of growth factor-reduced Matrigel resembled control COL + MA tissues in terms of morphology and contractility (COL + MA = 25.0  $\mu$ N; COL + MA<sub>-gf</sub> = 29.9  $\mu$ N; two-tailed *t*-test: P = 0.42). Similar to pure COL micro-tissues, COL + LAM<sub>100</sub> micro-tissues showed a low degree of compaction, presence of aggregates, and no active forces. COL + LAM<sub>200</sub> micro-tissues, however, compacted better and developed low levels of active contractile forces (3.8 µN), indicating that even moderate levels of pure laminin were able to improve micro-tissue formation and contraction. These data show that laminin-1 is important for myotube differentiation, while matrix-bound growth factors present in Matrigel are not. However, addition of 200 µg/ml laminin-1 was not sufficient to restore the full contractility. It is possible that higher laminin-1 concentrations similar to those found in Matrigel (approx. 600 µg/ml<sup>28</sup>), are required, or that other Matrigel components have also contributed to myotube differentiation.

Together, these data show that C2C12-based micro-tissues recapitulate key features of skeletal muscle, including laminin 1-dependent myoblast elongation and differentiation, electrical excitability, and contractile force generation, suggesting that they can be used as a functional in vitro model for striated muscle tissue.

#### Neonatal rat cardiomyocytes form micro-tissues with intact electrical coupling

Next, we investigated whether mechanoadaptive behavior is specific to skeletal muscle or applies broadly to striated muscle tissue. For this, we studied neonatal rat ventricular cardiomyocytes (NRVC) that have not yet undergone postnatal terminal differentiation and are lacking key features of adult cardiomyocytes such as a fully organized sarcomere apparatus and a rod-like cell shape. We first tested whether NRVCs were able to form micro-tissue in our system and whether cells and micro-tissues show features of adult cardiomyocytes and myocardial tissue, respectively. Over 3 days in culture, NRVCs had fully compacted the ECM into micro-tissues (Fig. 4A). NRVCs best formed micro-tissues using a lower collagen concentration (0.3 mg/ml) compared to C2C12 cells (0.6 mg/ml). Tissue formation did not require the addition of Matrigel, possibly because NRVCs were already partly differentiated in vivo.

Notably, confocal imaging of  $\alpha$ -actinin revealed an elongated morphology of NRVCs and a homogenous cross-striation pattern reminiscent of adult myocardial tissue in vivo (Fig. 4B). In addition, NRVC micro-tissues displayed spontaneous as well as electrically induced active contractions

already three days after cell seeding. The static forces of NRVC micro-tissues were one order of magnitude lower than those of C2C12 micro-tissues (typically  $1-10 \mu$ N), while the active forces were comparable (typically  $20 \mu$ N). The active contraction of NRVC micro-tissues followed the frequency of the electrical stimulation up to about 4 Hz (Fig. 4C). At higher frequencies, single force twitches did not fuse to a tetanic force as seen in skeletal muscle micro-tissues<sup>29</sup>, but still showed discernible pulses, closely mimicking the contraction dynamics of cardiac tissue in vivo. Consequently, the maximum active forces at higher stimulation frequencies (2, 4, 8, 10 Hz) remained unchanged compared to single pulse stimulation (0.5 and 1 Hz).

These data show that NRVC micro-tissues replicate essential features of terminally differentiated myocardial tissue, such as cardiomyocyte elongation and cross-striation as well as electrically inducible contraction, suggesting that, similar to our C2C12 micro-tissues, they are well suited for in vitro studies of cardiac muscle tissue.

## The active contractility of skeletal and cardiac muscle microtissues is mechanoadaptive

A key feature of our system is that the environmental stiffness seen by the micro-tissues can be tuned over a wide range, (i) by varying the volume of the bottom layer during the fabrication process so that the micro-tissues form at different heights h between the pillars (Fig. 5a), and (ii) by varying the PDMS crosslinker-to-base ratio, which changes the Young's modulus E of the pillars.

To investigate the influence of the mechanical environment and of culture time on the contractile performance, we first fabricated C2C12 micro-tissues with different *E* and *h* and measured the active and static contractile forces from day 4 to 9 after switching to differentiation medium (Fig. 5B). We found that the active forces *F* increased with environmental stiffness *k*, and that the relationship can be well approximated by a simple power-law relationship of the form  $F(k) = a \times (k/k_0)^b$ , where the factor *a* is a measure of contractile force at a nominal spring constant of  $k_0 = 1$  N/m, and the power-law coefficient *b* is a measure of mechanoadaptation (Fig. 5C). A power-law exponent of zero corresponds to a tissue that does not adapt to environmental stiffness, and an exponent of unity corresponds to a tissue that increases its contractile force linearly with increasing environmental stiffness.

On day 4—the first day with measurable, active contraction—active forces increased with *k* according to a power-law exponent  $b = 0.57 \pm 0.04$  (mean ± SE as determined by bootstrapping;  $R^2 = 0.53$ ,  $\rho = 0.82$ ), i.e., roughly with the square root of environmental stiffness (Fig. 5B). Over the next two days in culture, the degree of mechanoadaptation increased further, reaching a maximum power-law coefficient of  $1.03 \pm 0.05$  on day 6 ( $R^2 = 0.59$ ), hence contractility increased nearly linearly with environmental stiffness. By contrast, the static contractile force increased only weakly with *k* and reached a maximum power-law coefficient of  $0.17 \pm 0.04$  ( $R^2 = 0.18$ ) on day 5 (Fig. 5B). These data demonstrate a pronounced mechanoresponse of

Fig. 4 | Micro-tissues fabricated from neonatal rat cardiomyocytes. A Bright-field images of a representative micro-tissue on day 2 and 3 after cell seeding. Scale bar: 200  $\mu$ m. **B** Maximum projections of confocal image stacks of a micro-tissue fixed 5 days after cell seeding and stained for  $\alpha$ -actinin (red) and nuclei (DRAQ5, blue). Scale bar: 20  $\mu$ m; scale bar inset: 10  $\mu$ m. **C** Static and active contractility of a cardiac micro-tissue at different stimulation frequencies. In the insets, the black dashed lines represent the static forces and the orange dashed lines represent the minimum total force between pacing pulses. Percentages indicate the average minimum active force.





Fig. 5 | Mechanoadaptation of C2C12 micro-tissues. A Schematic of the relationship between bottom layer volume and tissue height. After 24 h of initial compaction, the micro-tissues are attached to the PDMS pillars approximately at the height of the bottom/cell layer interface. Since the effective spring constant *k* of the pillars depends on the micro-tissue height, a high/intermediate/low bottom layer (9/6/3  $\mu$ l) results in a low/moderate/high environmental stiffness. B Scatter plots of active and static forces of C2C12 micro-tissues versus *k* measured on days 4–7 after

initialization of differentiation. Dashed lines represent power-law fits. C Power-law coefficients for the same fits (with days 8 and 9 added). Bar plots show mean  $\pm$  SE as determined by bootstrapping. D Scatter plot of active deflections over *k* for day 5 with power-law fit. E Same as (D) but for static deflection. F Scatter plot of times-to-peak (i.e., the time at which the micro-tissues reach maximum deflection after electrical stimulation) versus *k* at day 5.

C2C12 micro-tissues that stems from differentiated myotubes, but not myoblasts.

We next explored how muscle shortening and hence pillar deflection changed with the spring constant, since the active force of striated muscle may decrease with increasing amount of shortening as the internal resistance against filament sliding increases<sup>30</sup>. To this end, we correlated pillar deflection for active and static forces with the corresponding spring constant. Consistent with the absence of a clear mechanoresponse of static force



Fig. 6 | Mechanoadaptation of NRVC micro-tissues. A Scatter plots of NRVC micro-tissue active forces versus *k* measured on days 3–6 after cell seeding. Dashed lines represent power-law fits. B Power-law coefficients for the same fits (with day 7 added). Shown are means ± SE derived from bootstrapping.

generation, the pillar deflection induced by static forces decreased over several orders of magnitude with increasing pillar stiffness. By contrast, the pillar deflection due to active forces was nearly constant, regardless of pillar stiffness. For example, on day 5, the static pillar deflection was strongly correlated with k ( $R^2 = 0.76$ ) and had a power-law coefficient of -0.85(Fig. 5E), while the active pillar deflection was only weakly correlated with k( $R^2 = 0.18$ ) and had a power-law coefficient of -0.20 (Fig. 5D). Together with the observation that the maximum amount of shortening was only 2% of the total tissue length, this finding suggests that the active forces of C2C12 micro-tissues in a softer microenvironment are not limited by filament sliding constraints or by a limited capacity to shorten. Consistent with this, the time required for the micro-tissues to reach maximum active contraction (time-to-peak) was independent of the spring constant (Fig. 5F).

We next tested whether cardiomyocyte micro-tissues prepared from NRVCs were also adapting to pillar stiffness. We observed a less pronounced but still strong mechanoadaptation response (Fig. 6A, B). These micro-tissues first exhibited active contraction at day 3 after initial cell seeding, with a power-law coefficient of the active forces versus *k* relationship of  $0.48 \pm 0.04$  ( $R^2 = 0.59$ ,  $\rho = 0.73$ ). Thereafter, the degree of mechanoadaptation decreased slightly with culture time, and the power-law coefficient was between 0.35 and 0.39 on days 4–6 and decreased to 0.25 on day 7. These data demonstrate that the mechanoadaptation is not limited to skeletal muscle micro-tissues, suggesting that the underlying mechanisms may be general to different types of striated muscle tissues.

# Only the contractile force but not the stiffness of muscle microtissues is mechanoadaptive

We next explored whether the stiffness of muscle micro-tissues adapts to the pillar stiffness. To measure the stiffness of micro-tissues, we stretched or compressed the PDMS device (Fig. 7A) and analyzed the relationship between the external force *F*, tissue shortening  $\delta_{\text{tissue}}$ , and pillar deflection  $\delta_{\text{pillar}}$ , as described in "Methods". Briefly, we assume a serial arrangement of three springs representing the micro-tissue and two pillars with the spring constants  $k_{\text{tissue}}$  and  $k_{\text{pillar}}$ , respectively (Fig. 7B). We measure  $\delta_{\text{tissue}}$  and  $\delta_{\text{pillar}}$  using bright-field imaging and determine  $k_{\text{pillar}}$  from calibration measurements (Fig. 7C). The tissue stiffness  $k_{\text{tissue}}$  can then be calculated using Eq. (3).

We performed these experiments with C2C12 micro-tissues for varying pillar stiffness on days 4 and 6 after switching to differentiation medium (the days on which we had measured the lowest and highest degree of mechanoadaptation, respectively). On both days,  $k_{\text{tissue}}$  was independent of  $k_{\text{pillar}}$  demonstrating that the stiffness of the micro-tissues is not mechanoadaptive. Furthermore,  $k_{\text{tissue}}$  was not significantly different between days (two-tailed *t*-test: P = 0.750), with an average spring constant of all measured micro-tissues of  $0.36 \pm 0.04$  N/m (mean  $\pm$  SE; Fig. 7D), corresponding to a Young's modulus of 9.2 kPa (for an effective tissue radius of 150 µm).

The effective spring constant of a C2C12 micro-tissue is on the same order of magnitude as the spring constant of the softest PDMS pillars used in this study. This creates a potential source of misinterpretation of mechanoadaptation responses, as the deflection of a soft pillar (which corresponds to the shortening of the tissue) may be so large that the internal tissue stiffness causes a substantial counter-force upon tissue compression that limits further shortening. To distinguish mechanoadaptation of the tissue from such passive force limitation, we calculated how tissue stiffness influences the relationship between contractile force and environmental stiffness for a tissue that is not mechanoadaptive (Fig. 7E, F, see "Methods"). Accordingly, for a non-mechanoadaptive tissue generating a contractile force *F*, the force measured from the pillar deflection ( $F_{\text{pillar}}$ ) increases approximately linearly with environmental stiffness  $k_{\text{pillar}}$  if  $k_{\text{tissue}} \gg k_{\text{pillar}}$ . For  $k_{\text{tissue}} \ll k_{\text{pillar}}$ , the measured  $F_{\text{pillar}}$  approaches the true tissue force *F*.

The pillar stiffness was between 2-fold and 150-fold higher than tissue stiffness, as indicated by the horizontal bar in Fig. 7F, hence  $k_{\text{tissue}} \ll k_{\text{pillar}}$ . In this case, there is only a weak dependency between pillar force and tissue stiffness for non-mechanoadaptive model tissues, with power-law exponents on the order of 0.1 and lower. Therefore, the strong power-law dependency of active forces with increasing pillar stiffness that we see in our measurements, is a signature of true mechanoadaptation and cannot be explained by a tissue compression that limits shortening, even on days where the power-law exponent was lowest (day 4 for skeletal muscle tissues, day 7 for cardiac muscle tissues) (Supplementary Fig. 3).

# Mechanoadaptation of C2C12 micro-tissues does not require maximum force magnitude

One strategy for microtissues to probe the stiffness of their environment is to exert force and quantify the resulting change in length. We therefore investigated whether the mechanoadaptation of micro-tissues is affected by the maximum force magnitude that they can generate. Previously, we have identified a role of the focal adhesion protein  $\beta$ -parvin in regulating myocyte shape, sarcomere assembly, and contractility in cardiac cells in response to mechanical load<sup>16</sup>. Micro-tissues prepared from Parvb-siRNA-treated NRVCs exhibited reduced active forces compared to micro-tissues prepared from control-siRNA-treated NRVCs<sup>16</sup>. Since  $\beta$ -parvin is also highly expressed in skeletal muscle<sup>16</sup>, we tested whether  $\beta$ -parvin knockdown affected the contractility and mechanoadaptation of C2C12 micro-tissues.

To this end, we fabricated C2C12 micro-tissues between PDMS pillars with different spring constants as described above, using cells treated with either control- (siControl) or Parvb- (siParvb) siRNA 24 h prior to tissue formation. SiControl micro-tissues were morphologically similar to untreated C2C12 micro-tissues (Fig. 8A) and started to actively contract on day 4. By contrast, siParvb micro-tissues were not able to fully compact the collagen matrix. Consistent with our observations in NRVC micro-tissues<sup>16</sup>, absolute active forces were strongly reduced by  $\beta$ -parvin knockdown on day 5, but recovered to the level of siControl micro-tissues by day 7 (Fig. 8B, C) likely due to siRNA-degradation over time. The static forces were also significantly decreased by  $\beta$ -parvin knockdown but did not recover to the levels of siControl micro-tissues after day 7. The distribution of pillar spring constants in siParvb and siControl experiments was comparable (Supplementary Fig. 4).

Strikingly, the mechanoresponsiveness of the active forces at day 5 and 7 were almost unaffected by  $\beta$ -parvin knockdown (Fig. 8B, D). The average power-law coefficient of the active force versus spring constant relationship for siControl micro-tissues was slightly but not significantly higher than that of siParvb micro-tissues for all days (siControl: 0.64–0.71; siParvb: 0.52–0.64, n = 5 independent experiments each with >100 tissues). This

Fig. 7 | Spring models for contractility and measurement of micro-tissue stiffness. A Schematic of a pre-stretched PDMS device. B Three-springmodel of a micro-tissues between two pillars during stretch/compression. Note that during uniaxial stretch/compression, one end of the serial spring assembly is fixed while the external force acts on the other end. C Scatter plot of tissue length versus total length (tissue length + pillar deflections) and tissue length versus deflection of one pillar. Dashed Lines represent linear fits. D Scatter plot of the calculated values of  $k_{\text{tissue}}$  versus the corresponding values of  $k_{\text{pillar}}$ . E Three-springs-model of a micro-tissues between two pillars during active/static contraction and equivalent circuit of one half of this arrangement (from one wall to the center of the microtissues). F Line plot of the analytical expression  $F_{\text{pillar}}/F$  versus  $k_{\text{pillar}}/k_{\text{tissue}}$ . Dashed lines represent power-law fits of F<sub>pillar</sub>/F in different decades of  $k_{\text{pillar}}/k_{\text{tissue}}$ . The line with vertical endpoints represents the stiffness range of the PDMS pillars used in previous experiments.



indicates that micro-tissues remain fully mechanoresponsive even when the active and static forces are markedly reduced. A plausible explanation is that the expression levels of  $\beta$ -parvin after transient siRNA knockdown recover inhomogeneously over time across the cell population, so that the active tissue force, although it is reduced, is generated by differentiated myotubes that may be fewer in number but are still fully mechanoresponsive.

To test the idea that a temporary  $\beta$ -parvin knockdown delayed muscle differentiation in C2C12 micro-tissues, we first analyzed the time course of micro-tissue contraction. The active force response after a single pulse (twitch force) can be modeled as a Dirac-pulse that is low-pass filtered twice with the same time constant  $\tau$ , as explained in "Methods". We find that  $\tau$  of siControl and siParvb tissues decreased over time after initiating muscle differentiation, consistent with the notion that  $\tau$  reports on the degree of muscle differentiation (Fig. 8F). The twitch time constant was significantly longer in siParvb micro-tissues compared to siControl micro-tissues (day 5; siControl: 137 ms; siParvb: 161 ms; two-tailed *t*-test:  $P < 10^{-10}$ ), but converged to similar levels over time (day 7; siControl: 82 ms; siParvb: 81 ms; two-tailed *t*-test: P = 0.73). This result supports the hypothesis that  $\beta$ -parvin knockdown suppressed muscle differentiation.

To further test whether  $\beta$ -parvin knockdown delayed muscle differentiation, we differentiated C2C12 cells in 2-D cell culture and repeatedly subjected them to transfection with control- or Parvb-siRNA for a sustained  $\beta$ -parvin knockdown over the entire culture time. Confocal microscopy of the cultures after immunofluorescence-staining for desmin as differentiation marker and phalloidin to label F-actin revealed a significantly reduced desmin/F-actin fluorescence-intensity ratio in siParvb- compared to siControl-cultures (Fig. 9a, b). In addition, the ratio of the nuclear muscle differentiation marker myogenin to the DNA-marker DRAQ5 was considerably reduced in the absence of  $\beta$ -parvin (Supplementary Fig. 5). These data demonstrate that  $\beta$ -parvin is required for the differentiation of C2C12myoblasts. However, a fraction of myotubes in siParvb-cultures showed regular desmin fluorescence intensity, suggesting that the recovery from  $\beta$ -parvin depletion, and hence the initial  $\beta$ -parvin knockdown, was not homogenous across the culture (Fig. 9a, insets).

To characterize the time course of β-parvin knockdown and recovery, we performed RT-PCR analysis of siControl and siParvb micro-tissues on days 0, 2, 4, and 6 after onset of differentiation (Fig. 9c). SiControl microtissues displayed a gradual increase in Parvb-mRNA from day 0 to day 6, in line with the requirement of  $\beta$ -parvin for C2C12- myoblast differentiation. By contrast, siParvb micro-tissues showed a complete loss of Parvb-mRNA between days 0 and 2, followed by a recovery of Parvb-mRNA between days 4 and 6 (Fig. 9c), demonstrating that the recovery of siParvb micro-tissues in active force generation between days 5 and 7 (Fig. 8B) coincides with a recovery of Parvb-mRNA expression. Together, these data show that  $\beta$ -parvin is required for C2C12-myoblast differentiation, and that  $\beta$ -parvin knockdown was efficient, but also transient and incomplete with a heterogeneous recovery, suggesting that the lower contractile forces in siParvb micro-tissues after 5 days of differentiation reflects a lower percentage of differentiated muscle fibers that were nonetheless similarly mechanoadaptive as muscle fibers under control conditions.

#### Discussion

In this study, we show that during cardiac and skeletal muscle differentiation and maturation, muscle contractility adapts to environmental stiffness. As a

Fig. 8 | Knockdown of β-parvin impairs absolute contractile forces, but not mechanoadaptation in C2C12 micro-tissues. A Bright-field images of micro-tissues prepared from control- and ParvbsiRNA-treated C2C12 cells. Images were taken 5 and 7 days (D5 and D7) after switching to differentiation medium. Scale bar: 200 µm. Scale bar in close-up: 100 µm. B Scatter plots of active and static forces of control-siRNA and knockdown micro-tissues at D5 and D7. Dashed lines represent power-law fits. C Bar plots of the same data. Bootstrapping; n.s.,  $P \ge 0.05$ ; ★ ★, P < 0.01. **D** Bar plots of the power-law coefficients of fits of active forces and spring constants from 4 to 5 independent experiments on D5-7. Two-tailed *t*-test; n.s.,  $P \ge 0.05$ . **E** Example time course of normalized active contractile force of a control siRNA-treated micro-tissue (dots) fitted by twofold low-pass filtered (with time constant  $\tau$ ) Delta-Dirac pulses applied at time points when the force exhibits local minima (dotted line). F Bar plots of the time constants  $\tau$  of active contractions in control- and Parvb-siRNA-treated micro-tissues at D5–7. Two-tailed *t*-test; n.s.,  $P \ge 0.05$ ;  $\bigstar \bigstar$ , P < 0.01.

model system, we use skeletal muscle micro-tissues grown from C2C12 differentiated C2C12 n myoblasts, and cardiac muscle micro-tissues grown from neonatal rat cardiomyocytes that self-assemble between two elastic pillars. The environmental stiffness experienced by the micro-tissues can be varied over three orders of magnitude by changing the effective spring constant of the pillars. The environthe deflection of the pillars.

Active contractile forces in response to electrical stimulation are measurable in micro-tissues after approximately 3–4 days in culture, after which the force magnitude increases until day 7. This temporal force increase correlates with the degree of desmin expression in C2C12 micro-tissues, indicating an increasing degree of myoblast-to-myotube differentiation. In C2C12 micro-tissues, the active force pulses in response to electrical pulses fuse to a tetanic force plateau when the pulse frequency is increased beyond  $10 \text{ Hz}^{29}$ , whereas in neonatal rat cardiac micro-tissues, single force pulses with fractional entrainment are still discernible, indicating an intact electrical coupling. Fully differentiated muscle displays a regular striation pattern of actin and myosin filaments that exhibit very slow turn-over<sup>31</sup> (Fig. 4b). Accordingly, treatment with the actin polymerization inhibitor cyto-D had little or no effect on the magnitude of active forces of

differentiated C2C12 micro-tissues, consistent with previous reports<sup>32</sup>. By contrast, static forces of cardiac and skeletal micro-tissues, which we attribute to cells that have not differentiated to myotubes, decrease to the level of permeabilized tissues within minutes after treatment with cyto-D. Taken together, these findings establish that both mouse C2C12 and NRVC micro-tissues can be used as a model system for structural and functional maturation of striated muscle tissue.

We find that the active contractile forces, but not the static baseline forces, of both skeletal and cardiac muscle micro-tissues strongly increase with the pillar spring constant according to a power-law relationship. The power-law exponent provides a quantitative measure of mechanoadaptation, whereby values around zero indicate absence of mechanoresponsiveness, and values near unity indicate a linear increase of force generation with environmental stiffness.

A correlation between external stiffness and contractility has been previously demonstrated in C2.7 myoblasts<sup>33</sup> and smooth muscle cells<sup>34</sup> grown on 2-D substrates. Micro-tissues allow in vitro studies to be performed in a 3-D microenvironment under similarly controllable laboratory conditions and with similar experimental throughput. Moreover, it is possible to precisely tune the mechanical boundary conditions by changing the





Fig. 9 |  $\beta$ -parvin is required for C2C12-differentiation in 2-D culture, and  $\beta$ -parvin knockdown is transient and inhomogeneous. a Confocal micrographs from control- and Parvb-siRNA-treated C2C12 cultures in 2-D after immunofluorescence staining for desmin as differentiation marker, phalloidin-staining to label F-actin and DRAQ5-staining to label nuclei. Images were taken 8 days after repeated  $\beta$ -parvin knockdown, and 6 days after switching to differentiation medium, respectively. Note the reduced fraction of desmin-positive myotubes (inserts) in

siParvb compared to siControl-samples. Scale bar: 50 µm. **b** Box plot of desmin/Factin fluorescence intensity ratio computed from confocal micrographs shown in (**a**); Paired two-tailed *t*-test; n = 5 independent biological experiments;  $\bigstar$ , P = 0.014. **c** RT-PCR analysis of the time course of Parvb-mRNA (194 bp) depletion and recovery after knockdown in 3-D cardiac microtissues. Actb (183 bp) was used as positive control.

effective spring constant of the flexible pillars between which the microtissues develop. This approach can be used to systematically investigate the contractile forces of micro-tissues over a sufficiently wide range of external stiffness and with a sufficient number of samples for a statistically sound evaluation.

In a previous study using such an approach, an increase in active and static forces of neonatal rat cardiomyocyte micro-tissues was observed for a pillar spring constant of  $0.45 \,\mu\text{N}/\mu\text{m}$  compared to a spring constant of  $0.2 \,\mu\text{N}/\mu\text{m}^{11}$ . However, the authors of this study did not systematically investigate this effect and suggested that the higher contractility in stiffer environments was a consequence of better tissue compaction. In our experiments, by contrast, micro-tissue compaction and tissue stiffness did not change notably with environmental stiffness.

Another study presented a system in which the boundary conditions of cardiac micro-tissue derived from human induced pluripotent stem cells (iPSCs) are regulated by real-time feedback control such that the pillars are pulled apart simultaneously with tissue contraction<sup>35</sup>. Under such near-isometric boundary conditions, contractile forces increased twofold compared to the unregulated condition, demonstrating that mechanoadaptation can be a very rapid process. In addition, iPSC micro-tissues also show a long-term adaptation of contractile forces to environmental stiffness, as shown in a study where the tissues were exposed to pillar spring constants between 0.1 to  $10 \,\mu$ N/ $\mu$ m<sup>36</sup>. In close agreement with our data, that study reported an

approximately 4.5-fold increase in contractile forces (from 57  $\mu$ N to 262  $\mu$ N) with higher stiffness, and a more pronounced maturation of the myocytes, as evidenced by an increased ratio of myosin heavy chain-beta to myosin heavy chain-alpha.

The observation of higher contractile forces in response to a higher environmental stiffness, however, could potentially be explained by two trivial mechanisms. First, muscle tissue shortening is limited by the maximum distance of actomyosin filament sliding within a sarcomere<sup>30,37,38</sup>. This limit will be reached more readily in the case of softer pillars, resulting in seemingly smaller maximum forces. This mechanism, however, cannot account for our findings as the deflections of stiffer pillars tended to be smaller than the deflection of softer pillars (Fig. 5D, E). As a second explanation, one could consider the pillar-micro-tissue system as an arrangement of three Hookean springs  $(2 \times k_{pillar} \text{ and } k_{tissue})^{39}$ . Accordingly, when  $k_{\text{pillar}}$  and  $k_{\text{tissue}}$  are similar, substantial portions of the contractile forces are carried by the tissue and are not observable by pillar bending. Hence, the pillar deflection reports the true contractile force only when  $k_{\text{pillar}} \gg k_{\text{tissue}}$  (Fig. 7F). Indeed,  $k_{\text{pillar}}$  was considerably larger than  $k_{\text{tissue}}$  for the vast majority of our measurements (Fig. 7D). Moreover, k<sub>tissue</sub> of C2C12 micro-tissues remained nearly constant over several days, whereas the degree of mechanoadaptation increased greatly during the same time period. In addition, a fit of the "three-spring-model" to the F versus  $k_{\text{pillar}}$ measurements cannot recapitulate the mechanoadaptation response and

fails especially at higher spring constants (Supplementary Fig. 2). Thus, we conclude that the observed mechanoadaptation responses of muscle microtissues are a biological phenomenon and cannot be attributed to such trivial mechanisms.

Skeletal muscle micro-tissues in which the focal adhesion protein  $\beta$ -parvin has been knocked down show reduced contractile forces and a lower degree of differentiation, as judged from the longer twitch time constant. The essential role of  $\beta$ -parvin in the differentiation of C2C12 cells was confirmed using a classical 2-D differentiation assay, with desmin and myogenin serving as differentiation markers. Reduced or absent desmin expression levels in muscle tissue have previously been associated with reduced force generation<sup>29,40</sup> and possibly impaired functional adaptive response to mechanical overload<sup>41</sup>. Our finding that muscle micro-tissues with reduced force generation after  $\beta$ -parvin knock-down maintain mechanoresponsiveness is therefore surprising.

A plausible explanation for this observation is the heterogeneous knockdown of  $\beta$ -parvin, which spares a subset of cells that differentiate normally and retain unaltered mechanoresponsiveness. Consistent with this hypothesis, we observed heterogeneous desmin-staining patterns in  $\beta$ -parvin-depleted C2C12 cultures during recovery from the knockdown. These findings suggest that mechanoadaptation in skeletal muscle micro-tissues is a cellular process, independent of large contractile forces at the tissue level. In support of this interpretation, we found that stiffness adaptation, as quantified by the power-law exponent, peaked on days 5–6 in culture, prior to the maximum development of contractile forces.

These findings may provide insight into the emergence of a power-law relationship, which is scale invariant, implying that the same power-law exponent can persist across different environmental stiffness ranges. If the force magnitude itself is not critical for stiffness sensing, then the same relationship can be expected to prevail across vastly different stiffness scales. A power-law relationship fulfills this criterion. Mechanotransduction mechanisms that operate across a wide range of environmental stiffnesses could also facilitate a spatial coordination of myoblast differentiation within different muscle regions. Comparable processes may occur during muscle adaptation and regeneration.

A limitation of our study is that the performance of muscle microtissues grown from both primary cardiac cells and the skeletal muscle cell line C2C12 declines after about 7–9 days in culture. Therefore, we cannot determine if muscle micro-tissues exposed to low environmental stiffness only differentiate more slowly but would eventually catch up in their maximum contractility if given sufficient time. This remains an open question and could be addressed by studying muscle tissues grown from induced pluripotent stem cells or from skeletal muscle stem cells (satellite cells), both of which have been shown to maintain contractility over a time span of at least several weeks<sup>29</sup>.

In summary, our study demonstrates that developing skeletal and cardiac muscle tissue displays a surprisingly large degree of mechanoadaptation over a wide range of environmental stiffness conditions spanning nearly three orders in magnitude.

#### Materials and methods

#### Isolation of neonatal rat cardiomyocytes

All experiments were performed in accordance with the guidelines from Directive 2010/63/EU of the European Parliament on the protection of animals used for scientific purposes. Organ harvesting and preparation of primary cell cultures was approved by the local Animal Ethics Committee in accordance with governmental and international regulations on animal experimentations (protocol: TS-9/16 Nephropatho). Ventricular cardio-myocytes were isolated from hearts of neonatal rats (P3) as previously described<sup>42</sup>. In brief, upon decapitation, hearts were isolated and the atria removed. The remaining ventricles were minced and digested utilizing the Neonatal Heart Dissociation Kit and the gentleMACS Dissociator (both Miltenyi Biotech), according to the manufacturer's instructions. To enrich cardiomyocytes, cells were preplated for 1.5 h in DMEM-F12/Glutamax TM-I (Life Technologies), supplemented with 10% fetal bovine serum (FBS,

Biowest), 100 U/ml penicillin and 100  $\mu$ g/ml streptomycin (Life Technologies). Non-attached cells were collected, pelleted (5 min at 300g) and resuspended in DMEM-F12/Glutamax TM-I, supplemented with 3 mM sodium pyruvate (Sigma Aldrich), 0.5% Insulin-Transferrin-Selenium (100×, Life technologies), 0.2% bovine serum albumin (Sigma Aldrich) and penicillin/streptomycin.

## **Cell culture**

C2C12 cells were cultured at standard incubation conditions (37 °C, 5% CO<sub>2</sub>, 95% humidity) in Dulbecco's modified Eagle medium supplemented with 15% fetal bovine serum (Sigma-Aldrich), 2% penicillin–streptomycin (Gibco), 2% L-glutamine (Gibco), 2% non-essential amino acid solution (Gibco), 1 mM sodium pyruvate (Gibco), and 60 mM HEPES buffer (Gibco).

#### Fabrication and culture of micro-tissues

Micro-tissues were grown as described previously<sup>29</sup>. In short, we cast PDMS devices, each consisting of 18 small wells with dimensions of  $3.6 \times 1.8 \times 2$  mm ( $l \times w \times h$ ) with two pillars (diameter: 500 µm, height: 2.5 mm, center-to-center distance: 1.8 mm). Before cell seeding, the PDMS devices were incubated overnight with a solution of 1% pluronic acid F-127 (Sigma-Aldrich) in water to prevent cells and matrix proteins from adhering to the chamber walls (Supplementary Fig. 6). Then, we aspirated the coating and pipetted a bottom layer of 6 µl ice-cold unpolymerized collagen solution into each well.

For micro-tissues from neonatal rat cardiomyocytes, 1 ml collagen solution consisted of 50  $\mu$ l of 2 mg/ml collagen R (collagen I from rat tail veins, Matrix Bioscience), 48  $\mu$ l from 4.2 mg/ml collagen G (collagen I from bovine calf skin, Matrix Bioscience), 12.4  $\mu$ l NaHCO<sub>3</sub> (23 mg/ml, Sigma-Aldrich), 12.4  $\mu$ l 10× DMEM (Seraglob), 1.9  $\mu$ l NaOH (1 M), and 876  $\mu$ l of dilution medium consisting of one volume part NaHCO<sub>3</sub>, one volume part 10× DMEM, and eight volume parts H<sub>2</sub>O, adjusted to pH 10 using NaOH.

To obtain contractile micro-tissues grown from C2C12 cells, it was necessary to increase the collagen concentration and to add Matrigel. Here, 1 ml of collagen solution consisted of 100  $\mu$ l of 2 mg/ml collagen R, 95  $\mu$ l of 4.2 mg/ml collagen G, 98  $\mu$ l of 10.2 mg/ml Matrigel (Corning), 37.1  $\mu$ l NaHCO<sub>3</sub> (0.2737 mM), 37.1  $\mu$ l 10× DMEM, 3.7  $\mu$ l NaOH (1 M), and 629  $\mu$ l of dilution medium.

After pipetting 6  $\mu$ l of unpolymerized matrix solution for the bottom layer to the wells, we centrifuged the PDMS devices (1 min at 300 g) and incubated them under standard conditions for 1 h for polymerization. Then, we pipetted a top layer of 6  $\mu$ l ice-cold unpolymerized matrix solution mixed with 5000 cells on top of each bottom layer and incubated the samples for another hour without prior centrifugation. Then we carefully pipetted 1 ml of culture medium on top of the wells in each PDMS devices and thereafter changed the medium daily.

We vary the height at which the micro-tissues form between the pillars by varying the volumes of the bottom layer and the cell layer (in this study, we use bottom layers of 3, 6, and 9  $\mu$ l and cell layers of 9, 6, and 3  $\mu$ l). Typically, the micro-tissues do not remain at the exact height at which they originally form after polymerization of the collagen, as they can slide upwards over time. This sliding is also affected by the casting-related roughness of the pillars and leads to a wide distribution of the tissue heights and thus of the spring constants (Fig. 5B, Supplementary Fig. 7).

Micro-tissues from neonatal rat cardiomyocytes were cultured in Dulbecco's modified Eagle medium/Ham's F-12 (Gibco) supplemented with 5% fetal bovine serum (Sigma-Aldrich), 5% horse serum (Gibco), 2% penicillin–streptomycin (Gibco), 2% L-glutamine (Gibco), and 20  $\mu$ M Cytosin-1- $\beta$ -D-arabinofuranosid (Sigma-Aldrich). Micro-tissues from C2C12 cells were cultured in C2C12 cell culture medium (see section Cell culture) for the first 24 h after seeding. Afterwards, we switched to a differentiation medium consisting of Dulbecco's modified Eagle medium supplemented 0.5% horse serum (Gibco), 0.5% Insulin–Transferrin–Selen (Gibco), 2% penicillin–streptomycin (Gibco), 2% L-glutamine (Gibco), 2% non-essential amino acid solution (Gibco), and 1 mM sodium pyruvate (Gibco).

#### Parvb gene-silencing

SiRNA-mediated silencing of the beta-parvin gene (Parvb) in NRVC microtissues was performed as described previously<sup>16</sup>. Briefly, NRVC were transfected in suspension immediately after cell isolation for 30 min. The cellcontaining transfection-mix was subsequently added to the collagen-solution used for the top-layer preparation of the micro-tissues. NRVCs were transfected with Parvb-specific and non-specific control siRNA (Thermo Fisher Silencer Select pre-designed siRNA ID #s170128 and Silencer Select negative control siRNA #4390843) using RNAiMax transfection reagent (Thermo Fisher Scientific) according to manufacturer's instructions. Parvb-silencing in C2C12 skeletal muscle-microtissues was achieved by transfection of undifferentiated C2C12-cells in 2-D culture using the same siRNAs and RNAiMax transfection reagent according to manufacturer's instructions. Twenty-four hours after siRNA-transfection, the cells were used for micro-tissuesassembly as described above, followed by switching to differentiation medium 24 h after micro-tissues-assembly, i.e., 48 h after siRNA-transfection. Parvbsilencing in C2C12 2-D cultures was performed identically, but cells were kept in 2-D culture. 48 h after siRNA-transfection, the medium was replaced with differentiation medium. Seventy-two hours after the first siRNA-transfection, the second round of siRNA-transfection was performed on the cultures, identically to the first round.

#### **RT-PCR** analysis

SiControl and siParvb C2C12-micro-tissues were harvested with forceps from the pillars at days 0, 2, 4, and 6 after the onset of differentiation, i.e., 2, 4, 6, and 8 days after siRNA transfection, and immediately snap-frozen using liquid nitrogen. mRNA was isolated using the RNeasy kit (Qiagen, Hilden, Germany) according to manufacturer's instructions, and subjected to RT-PCR analysis using Parvb- and Actb-specific primers (ParvbF 5'-CCCGGCTTTGG TGGACATT-3', ParvbR 5'-GGCCATCGTACAGGTCCTC-3', 194 bp PCR-product; ActbF 5'-GATCAAGATCATTGCTCCTCCTG-3' and ActbR 5'-AGGGTGTAAAACGCAGCTCA-3', 183 bp PCR-product), to confirm successful Parvb-mRNA depletion and to monitor the time course of recovery from Parvb mRNA-depletion.

#### Neural network detection of pillar deflection

We trained a neural network to detect the positions of the PDMS pillars in the recorded bright-field images. We used a modified version of the OR-UNet<sup>43</sup> without batch normalization and a low number of filters (16, 32, 64, 128, 128, 128, 128 for the layers). We first pre-trained the neural network for 200 epochs with a batch size of 15 on 965 images on which the circular pillar outline was manually labeled. Images were cropped to obtain an equal number of background and pillar pixels. After pre-training, we trained the neural network again on the whole images with a batch size of 1 for 200 epochs. Data were augmented during training with (i) x–y flipping, (ii) up to 2.5° rotation, (iii) contrast degeneration, (iv) Gaussian blur with a width of maximal 5 pixels, (v) brightness adjustment, and (vi) slight zoom (between  $0.95 \times$  and  $1.05 \times$ ).

To detect the pillar positions, the images were passed through the network, binarized by thresholding, topologically "closed" (binary dilation followed by erosion), and analyzed using the function *regionprops* from the Python scikit-image library to determine the x-y position of areas larger than 500 pixels. The automatic evaluation determined the distances between pillars with only a 0.4% relative standard deviation from the manually labeled distances. Automatically determined pillar centers were on average 3 pixels away from the hand labeled pillar centers.

#### Analysis of contractile force

The axial contractile force *F* of the micro-tissues was determined from the pillar deflections  $\delta$  as described previously<sup>29</sup>. In brief, the relationship of *F* and  $\delta$  is given by Hooke's law

$$F = k \times \delta \tag{1}$$

where k is the pillar's spring constant at the height of the tissue above the pillar base h. k is computed from the Euler–Bernoulli beam equation

$$k = k_0 / (h/h_0)^3$$
 (2)

where  $h_0$  is an arbitrarily chosen reference height of 1 mm and  $k_0$  is a characteristic spring constant at that height. The value of  $k_0$  depends on the PDMS's crosslinker-to-base ratio, curing time, and curing temperature. We determined  $k_0$  for PDMS pillars of all curing conditions used for this study from the force-bending relationship using a micromanipulator (Eppendorf InjectMan NI2).

We distinguish between static and active forces of micro-tissues. Static force is defined as the force resulting from pillar bending of myocytes that are not electrically paced. Active force is defined as the contractile force in response to electrical pacing above the static force. Active force is calculated from the maximum pillar deflection during contraction compared to the length of the micro-tissue in the unpaced state. Bipolar electrical field stimulation was applied using a custom-made pacing device with four electrodes as described previously<sup>29</sup>.

#### Immunofluorescence staining

Cardiac and skeletal muscle micro-tissues were fixed and stained within the PDMS devices. Fixation was performed using 4% paraformaldehyde in phosphate-buffered saline (PBS) for 20 min, followed by three times washing with PBS for 10 min. The micro-tissues were then permeabilized in 0.5% Triton X-100 in PBS for 5 min and blocked in 3% bovine serum albumin (BSA) in PBS before they were incubated with primary antibodies (anti-sarcomeric alpha actinin (Abcam #9465) or desmin (Cell Signaling #5332)) at a dilution of 1:250 in blocking solution at 4 °C overnight. The next day, the samples were washed three times in PBS for 10 min. The microtissues were then incubated with a secondary antibody (either Jackson #715-025-150 or #711-095-152) at a dilution of 1:200 in blocking solution for 2 h, and then washed three times in PBS for 10 min. For the first washing step, the nuclear dye DRAQ5 (Abcam) was added to the PBS at a concentration of 1.7 µM. Fixation and immunofluorescence-staining of 2-D C2C12-cultures was performed identically. Anti-myogenin (BD #556358) was used at a dilution of 1:500.

#### Imaging

Bright-field images were taken with a complementary metal-oxide semiconductor camera (Basler acA4112-30um). Confocal images were taken with an upright SP5X laser scanning microscope (Leica) using a 20×/1.0NA dip-in water-immersion objective lens. We recorded image stacks of 755 × 755  $\mu$ m at a z-section distance of 2  $\mu$ m for a depth of 150  $\mu$ m into the micro-tissues. We maximum-projected the confocal image stacks of different wavelength channels and merged them using the image processing software ImageJ. Confocal imaging of 2-D C2C12-cultures was performed using the same objective lens on the same microscope system by recording image stacks of 369 × 369  $\mu$ m at a z-section distance of 2  $\mu$ m for a depth of 20  $\mu$ m into the culture. Imaging of individual biological replicates was performed under identical conditions and imaging-parameters on the same day for siControl- and siParvb-samples to allow for comparability between both groups. Image stacks were maximum-projected prior to quantitative analysis using ImageJ.

#### **Confocal image quantification**

Confocal micrographs of 2-D C2C12-cultures were maximum-projected prior to analysis using ImageJ. The fluorescence intensity for each image channel was integrated over the entire image to calculate the fluorescence intensity ratios for desmin/phalloidin and myogenin/DRAQ5.

#### Statistical methods

We used a two-tailed Student's *t* test to compare groups. A *p* value < 0.05 was considered significant. In scatter plots, we examined the correlation between *x*-values and *y*-values by means of the coefficient of correlation (R2)

and the Pearson correlation coefficient ( $\rho$ ) as indicated in the figures. In bar graphs, whiskers represent standard errors. In boxplots, median values are represented by lines, and whiskers represent 5% and 95% percentiles.

#### Analysis of micro-tissue stiffness

Our PDMS devices are designed such that they can be mounted on a stepper motor-driven uniaxial cell stretcher device<sup>44</sup>. This allows us to determine the stiffness of micro-tissues by applying an external strain and evaluating the resulting tissue force and tissue strain. The relationship between the external force F, tissue shortening  $\delta_{\text{tissue}}$  and pillar deflection  $\delta_{\text{pillar}}$  can be modeled by a serial arrangement of three springs (Fig. 7B): a spring with spring constant  $k_{\text{tissue}}$ , representing the micro-tissue, is connected at both ends to a spring with spring constant  $k_{\text{pillar}}$  representing the pillars. In this model, F acts on the springs at one end (representing the moving end of the cell stretcher), while the other end is attached to a wall (representing the stationary end of the cell stretcher). Due to their serial arrangement, F acts equally on each individual spring. The stepwise compression of the PDMS device allows us to effectively vary F and measure the absolute micro-tissue length and the absolute pillar deflections via bright-field imaging. The ratio of the changes in micro-tissue length with respect to the total length or with respect to the deflection of a single pillar can then be used to fit the ratio  $\delta_{\text{tissue}}/\delta_{\text{pillar}}$ (Fig. 7C). Because  $k_{\text{pillar}}$  is known from calibration measurements as described above,  $k_{tissue}$  can be estimated as

$$k_{tissue} = k_{pillar} \times \delta_{pillar} / \delta_{tissue} \tag{3}$$

#### Force-tissue stiffness relationship in the absence of mechanoadaptation

To predict how tissue stiffness influences the relationship between contractile force and environmental stiffness when the tissue is not mechanoadaptive, we consider that the two pillars and the tissue (Fig. 7B) can be thought as being connected to walls at both ends (Fig. 7E). The tissuegenerated active or static force F, which in the following we assume to be constant (i.e., not mechanoadaptive) acts on the two pillars and is directed toward the center of the micro-tissue. As a result, the center of the microtissue remains stationary during contraction. This is equivalent to the situation where F acts on a parallel arrangement of a pillar and half of the micro-tissue connected to a wall on one side, which doubles the effective spring constant of the tissue so that the total spring constant of the arrangement is  $k = k_{pillar} + 2 \times k_{tissue}$ . We assume that the tissue behaves as a linear Hookean spring with the same spring constant in extension and compression so that  $F = (k_{pillar} + 2 \times k_{tissue}) \times \delta_{pillar}$ . To visualize how the measured force from the pillar deflection deviates from the tissue-generated force as a function of tissue stiffness, we plotted the ratio of  $F_{\text{pillar}}/F$  against the ratio of  $k_{\text{pillar}}/k_{\text{tissue}}$  (Fig. 7F).

#### Time course of a contractile force twitch

The speed of force build-up and relaxation during a single twitch depends chiefly on the acto-myosin bridge dynamics and the rate of Ca<sup>2+</sup> ion reuptake by the sarcoplasmic reticulum. The Ca<sup>2+</sup> ion reuptake rate distinguishes low and fast twitch muscle fibers and reflects the degree of muscle differentiation independent of the number of differentiated fibers in a tissue and the total active force<sup>45,46</sup>. Ca<sup>2+</sup> ion release into the cytoplasm can be regarded as near-instantaneous after delivering an electric pulse, i.e., it can be modeled as a delta-Dirac pulse, and the reuptake approximately follows a first-order kinetic process, hence it is well-described by a single exponential function. The time course of contractile force in turn follows the cytoplasmic Ca<sup>2+</sup> concentration also according to a first-order kinetic process so that it can be modeled as a Dirac-pulse that is low-pass filtered twice<sup>47</sup>. For simplicity, we chose the time constants of the two low-pass filters to be equal so that we fit only a single time constant to the force versus time signal, normalized to the maximum force after the static force has been subtracted. Despite having only one free fit parameter, the quality of the fit is excellent

(Fig. 8E), and we can thus regard the fitted time constant as a measure for the rate of force buildup and force relaxation.

#### **Ethics approval information**

Husbandry and decapitation of neonatal rats to harvest organs conformed to the guidelines from Directive 2010/63/EU of the European Parliament on the protection of animals used for scientific purposes and were approved by the local Animal Ethics Committee in accordance with governmental and international guidelines on animal experimentation (approval: TS-9/16 Nephropatho or TS-17/2023 Nephropatho). Sprague-Dawley rats were purchased (Charles River), maintained, and bred in the main local animal facility (PETZ). Rats were housed in same-sex cages under a 14-h light and 10-h dark cycle. Food and water were provided ad libitum. Three-day-old postnatal Sprague-Dawley rat pups of both sexes were decapitated using sterile scissors (according to FELASA guidelines). The chest was then opened along the sternum to access the chest cavity and the heart. Hearts were isolated and digested using the gentleMACS Dissociation kit (Miltenyi Biotech GmbH, Bergisch Gladbach, Germany) according to the manufacturer's instructions.

# **Data availability**

All data needed to evaluate the conclusions in the paper are present in the paper and/or the Supplementary Materials. Raw data and additional data related to this paper can be obtained from the corresponding author on request.

# Code availability

The underlying code and training/validation datasets for this study can be provided from the corresponding author on request.

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# **Author contributions**

D.K., J.L., T.W., I.T., S.V., C.A.D., and D.B. performed the experiments. D.K., M.S., C.A.D., J.K., S.W., I.T., and B.F. conceived and developed the microtissues assay. D.K., I.T., and B.F. analyzed the data. D.K., S.V., and I.T. conceived the genetic experiments. S.V., T.U.E., F.B.E., and I.T. provided material. D.K., R.C.G., and B.F. conceived and programmed software for data evaluation. D.K., I.T., and B.F. wrote the manuscript. D.K., I.T., and D.B. created the figures. All authors discussed the results and contributed to the final manuscript. All authors have read and approved the manuscript.

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# **Competing interests**

The authors declare no competing interests.

# **Additional information**

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