

Simultaneous *in vivo* time-lapse stiffness mapping and fluorescence imaging of developing tissue

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Abstract

Tissue mechanics is important for development; however, the spatio-temporal dynamics of *in vivo* tissue stiffness is still poorly understood. We here developed tiv-AFM, combining time-lapse *in vivo* atomic force microscopy with upright fluorescence imaging of embryonic tissue, to show that in the developing *Xenopus* brain, a stiffness gradient evolves over time because of differential cell proliferation. Subsequently, axons turn to follow this gradient, underpinning the importance of time-resolved mechanics measurements.

During embryonic development, many biological processes are regulated by tissue mechanics *in vivo*, including cell migration¹, neuronal growth², and large-scale tissue remodelling^{3,4}. Recent measurements at specific time points suggested that tissue mechanics change during developmental^{2,5,6} and pathological^{7,8} processes, which might significantly impact cell function. Furthermore, several approaches have recently been developed to measure *in vivo* tissue stiffness, including atomic force microscopy^{1,2,9}, magnetic resonance elastography¹⁰, Brillouin microscopy¹¹, and magnetically responsive ferrofluid microdroplets¹². However, the precise spatiotemporal dynamics of tissue mechanics remains poorly understood, and how cells respond to changes in local tissue stiffness *in vivo* largely unknown.

To enable time-resolved measurements of developmental tissue mechanics, we here developed time-lapse *in vivo* atomic force microscopy (tiv-AFM), a method that combines sensitive upright epifluorescence imaging of opaque samples such as frog embryos with iterated AFM indentation measurements of *in vivo* tissue at cellular resolution and at a time scale of minutes (**Fig. 1**). A fluorescence zoom stereomicroscope equipped with an sCMOS camera (quantum yield 82%) were custom-fitted above a bio-AFM set-up (**Supplementary Fig. 1**), which had a transparent pathway along the area of the cantilever. To cope with the long working distances required for imaging through the AFM head, the microscope was fitted with a 0.125 NA / 114 mm WD objective. The AFM was set up on an automated motorised stage containing a temperature-controlled sample holder to maintain live specimens at optimal conditions during the experimental time course. (**Fig. 1a, b**) (see online methods for details).

We tested tiv-AFM using the developing *Xenopus* embryo brain during outgrowth of the optic tract (OT) as a model (**Fig. 1c**). In the OT, retinal ganglion cell axons grow in a bundle across the brain surface, making a stereotypical turn in the caudal direction *en route* that directs them to their target, the visual centre of the brain¹³. We previously demonstrated that by later stages of OT outgrowth (i.e. when axons had reached their target), a local stiffness gradient lies orthogonal to the path of OT axons, with the stiffer region rostral to the OT and softer region caudal to it². This gradient strongly correlated with axon turning, with the OT routinely turning caudally towards softer tissue². We therefore wanted to determine when this stiffness gradient first developed, whether its emergence preceded OT axon turning, and what the origin of that stiffness gradient was.

To answer these questions, we performed iterated tiv-AFM measurements of the embryonic brain *in vivo* at early-intermediate stages, i.e. just before and during turn initiation by the first ‘pioneer’ OT axons. The apparent elastic modulus K , which is a measure of the tissue’s elastic stiffness, was assessed in a $\sim 150 \mu\text{m}$ by $250 \mu\text{m}$ raster at $20 \mu\text{m}$ resolution every ~ 35 minutes, producing a sequence of ‘stiffness maps’ of the area (**Supplementary Fig. 2**). To reduce noise, raw

AFM data were interpolated and smoothed in x -, y -, and time dimensions using an algorithm based on the discrete cosine transform (**Fig. 1d**, see online methods for details)^{14,15}. Simultaneously, we recorded optical time-lapse images of fluorescently labelled retinal ganglion cell axons growing through the region of interest (**Fig. 1d, Supplementary Fig. 2a**).

Early in the time-lapse sequence (i.e. prior to axon turning), the stiffness of the brain was similar on both sides of the OT. However, over the time course of the measurements a stiffness gradient arose, mostly due to rising stiffness of tissue rostral to the OT (**Fig. 1d**). Visual inspection of the fold-change in tissue stiffness from one time point to the next indicated that significant changes in tissue mechanics were already occurring approximately 40 – 80 minutes after the onset of measurements (**Supplementary Fig. 2c**), i.e., before axons started turning caudally, suggesting that the tissue stiffness gradient was established prior to axon turning.

To test this hypothesis, we quantified the temporal evolution of the stiffness gradient in a small region immediately in front of the advancing OT. At the beginning of each time point in the sequence of tiv-AFM maps, we calculated the size of the angle through which axons turned ('OT turn angle'). For each animal, minimum and maximum absolute values were rescaled to 0 and 1, respectively. The projected appearance of the stiffness gradient significantly preceded the projected onset of axon turning (**Fig. 2b**), indicating that axons turned after the stiffness gradient was established (**Fig. 2a**), which is consistent with a role for mechanical gradients in helping to guide OT axons caudally². In line with this idea, RGC axons from heterochronic eye primordia transplants growing through *Xenopus* brains at stages before the stiffness gradient is established grow rather straight and do not turn caudally in the mid-diencephalon¹⁶.

We have previously shown that tissue stiffness scales with local cell body density^{1,17}, and that in *Xenopus* embryo brains local stiffness gradients at later developmental stages (39/40) correlate with a gradient in cell density². To determine if changes in cell densities are driving changes in tissue stiffness, and thus parallel the evolution of the stiffness gradient at earlier stages, we assayed cell densities using DAPI labelling of nuclei in whole-mounted brains with fluorescently labelled OTs, beginning at the morphological stage corresponding to the start of tiv-AFM measurements (33/34) and repeated for the two subsequent stages encompassing OT turning (35/36 and 37).

While at the first stage cell densities on both sides of the OT were similar, a clear difference in nuclear densities rostral and caudal to the OT developed at later stages (**Fig. 2c**). Cell densities at the two later stages were significantly higher in the region rostral to the OT (i.e. where tissue was stiffer) than caudal to it, and the overall magnitude of the cell density gradient significantly rose over time (**Fig. 2d**). Plotting the stage-specific gradient in cell body densities against the stiffness gradient

revealed a strong linear correlation between them (Pearson's correlation coefficient $p = 0.97$) (**Fig. 2e**).

To test if local cell densities drive the evolution of the stiffness gradient during OT turning, we repeated both nuclear staining and tiv-AFM measurements on embryos treated with the mitotic blocker BI2536¹⁸, which has previously been used to inhibit *in vivo* cell proliferation in the embryonic retina¹⁹. In BI2536-treated brains, the nuclear density rostral to the OT and thus the cell density gradient was significantly decreased compared to controls, particularly at later stages (**Fig. 2c**). Blocking cell proliferation furthermore significantly attenuated both the stiffness gradient and the OT turn angle (**Fig. 2f, g**), suggesting that the gradient in cell densities is responsible for the stiffness gradient, which on the other hand instructs axon growth.

Tiv-AFM allows simultaneous time-lapse measurements of cell and tissue mechanics *in vivo* and optical monitoring of fluorescently labelled structures at the surface of otherwise optically opaque samples at length and time scales that are relevant for developmental processes. It enabled us for the first time to trace the *in vivo* mechanical properties of the embryonic *Xenopus* brain as the embryo developed, and to relate mechanical tissue changes to a key event in axon pathfinding.

More broadly, tiv-AFM can also be easily adapted for *in vivo* applications in other small organisms, or alternatively in tissues *ex vivo*. It can be used to study cellular responses to a range of mechanical stimuli via the AFM *in vivo*, such as sustained compression^{1,2}, or to track the temporal mechanical response of tissues or organs to different pharmacological treatments (such as the mitotic inhibitor used here). Additionally, the setup is very versatile and can be further expanded, for example, by combining it with calcium imaging to investigate how cellular activity is regulated by changes in tissue stiffness during development and pathology. Tiv-AFM will greatly expand the range of bio-AFM experiments possible, allowing for more scope both for a detailed characterisation of *in vivo* tissue mechanics during development and disease progression, and for testing how mechanics shapes cell behaviour and function.

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Figures

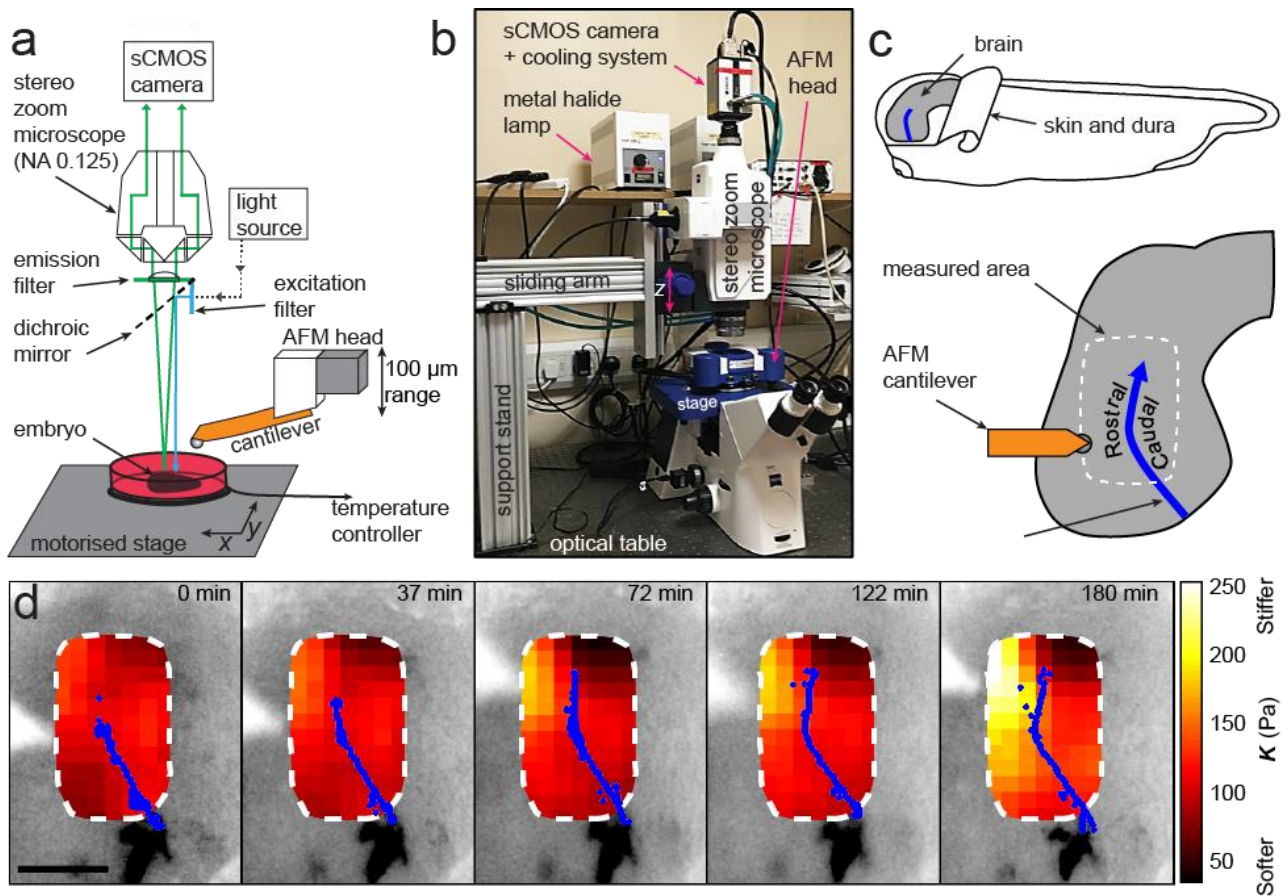


Figure 1: Combined time-lapse *in vivo* AFM (tiv-AFM). (a) Schematic (not to scale) and (b) photograph of the experimental setup. An AFM with 100 µm z -piezo range is positioned above a temperature-controlled sample chamber containing the specimen. A custom-fit fluorescence zoom stereomicroscope with a long (114 mm) working distance and NA 0.125 objective, connected to a high quantum-efficiency sCMOS camera, is mounted on a custom-built support stand above the AFM head optimised for trans-illumination. The specimen is moved by a motorised x/y stage to allow AFM-based mapping of large areas. (c) Schematic of a *Xenopus* embryo, showing how the brain is prepared for tiv-AFM (top) and close-up of the brain (bottom) showing the approximate region measured, within which optic tract (OT) axons (blue) turn caudally. (d) Time-lapse stiffness maps obtained from a tiv-AFM experiment, showing outlines of fluorescently labelled OT axons (blue) and processed AFM-based stiffness maps (colour maps) overlaid on images of the brain. Colour maps encode the apparent elastic modulus K , a measure of tissue stiffness, assessed at an indentation force $F = 10$ nN. The time in minutes on each frame is taken from the timestamp of the first measurement in each successive stiffness map; the corresponding overlaid fluorescence images were obtained simultaneously. AFM measurement resolution, 20 µm; scale bar, 100 µm.

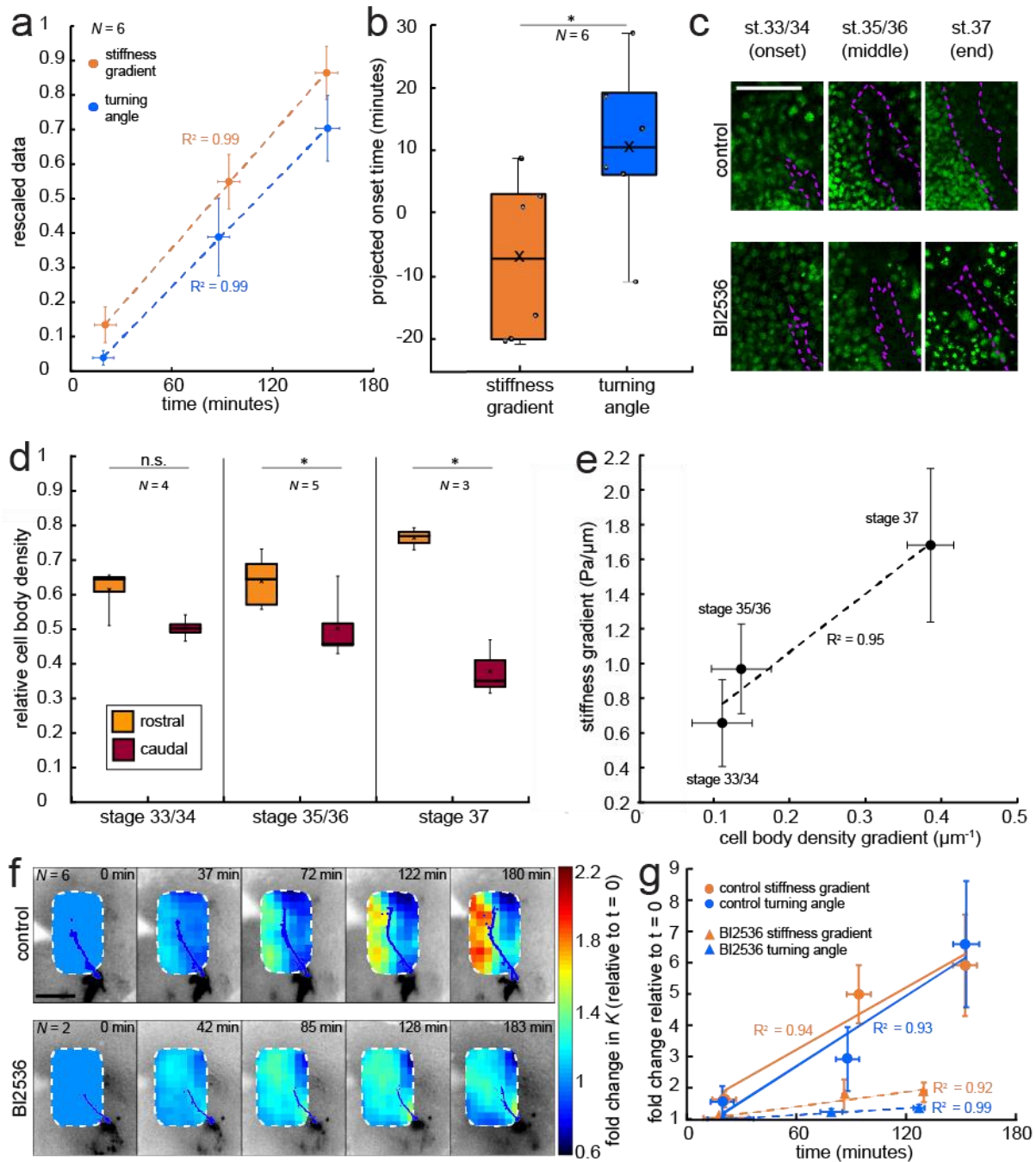
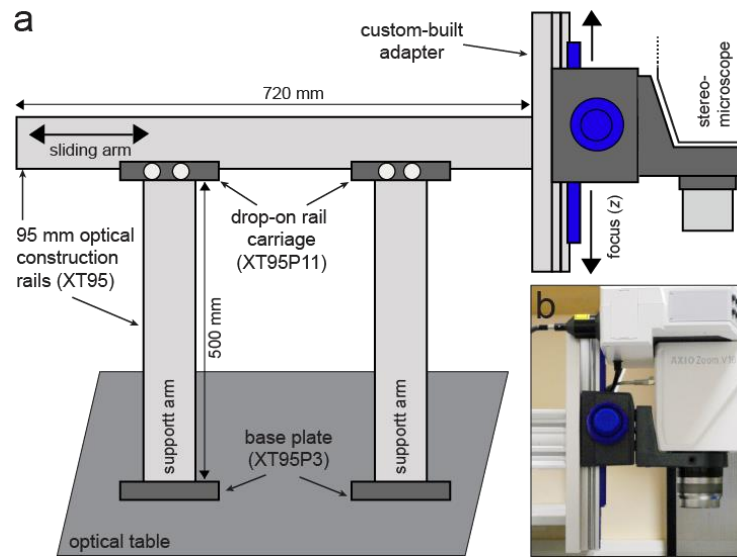


Figure 2: Development of mechanical gradients in *Xenopus* embryo brains precedes axon turning and is underpinned by changes in local cell body densities. (a) Plot of mean re-scaled values for the stiffness gradient (orange) and OT turn angle (blue). Dashed lines denote linear fits ($R^2 = 0.99$). (b) Boxplots of the extrapolated appearance times of the stiffness gradients and the onset of OT axon turning, relative to the start time of tiv-AFM measurements. Extrapolations are based on linear fits to the re-scaled data for individual animals. Stiffness gradients appear significantly earlier than the onset of axon turning ($p = 0.03$, paired Wilcoxon signed-rank test). (c) Immunohistochemistry of nuclei (green) in whole-mount control (middle row) and mitotic inhibitor-

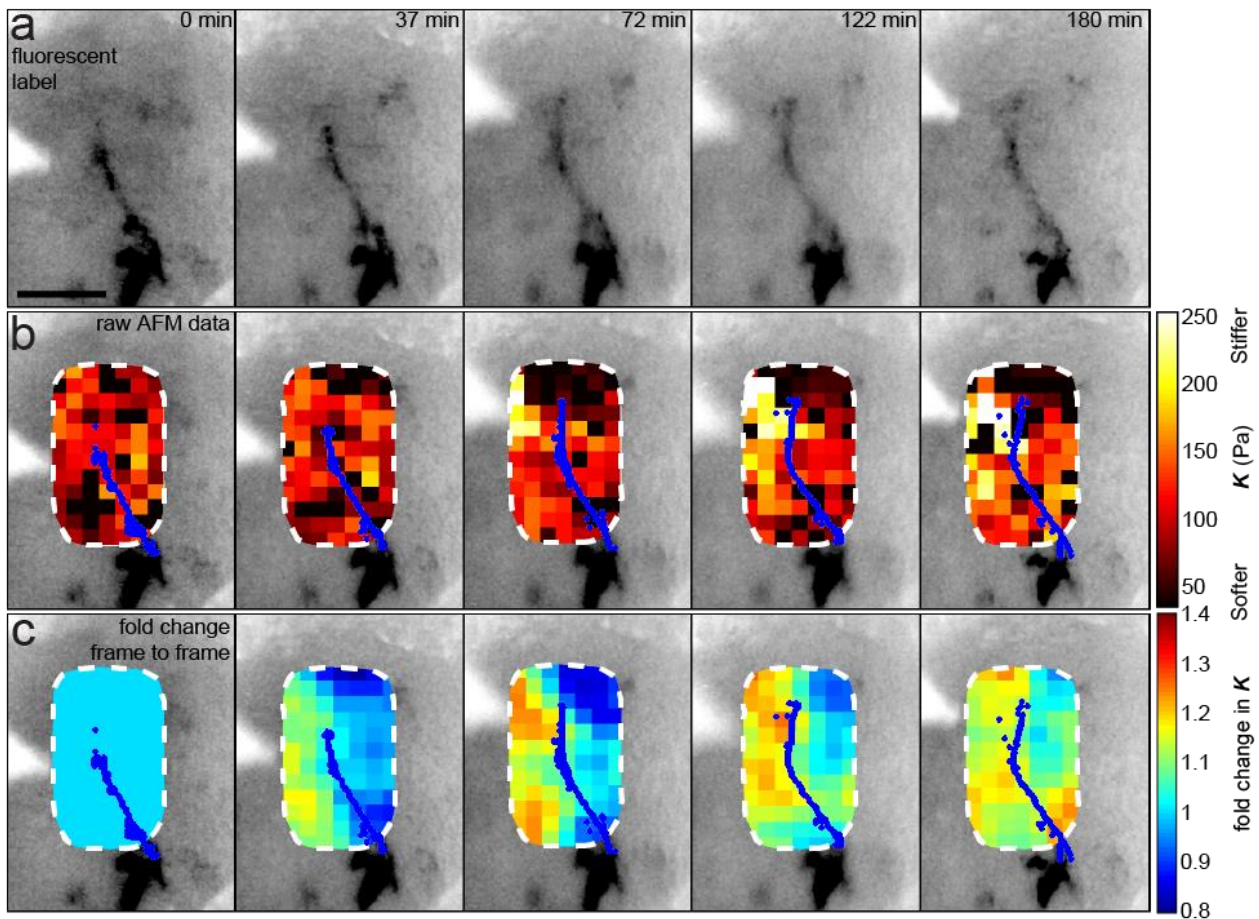
treated (bottom) *Xenopus* embryo brains at successive developmental stages. Stages shown correspond to the onset (stage 33/34), middle (stage 35/36), and end (stage 37) of tiv-AFM measurements. OT axons are outlined in purple. (d) Local cell body densities were significantly higher rostral to the OT than caudal to it at both stage 35/36 ($p = 0.03$, paired Wilcoxon signed-rank test) and stage 37 ($p = 0.04$). (e) Correlation between gradients in local cell body density and tissue stiffness. Binned absolute values for the stiffness gradient (in Pa/ μm) are plotted against the mean cell density gradient at each developmental stage. Dashed line denotes linear fit ($R^2 = 0.95$; Pearson's correlation coefficient $p = 0.97$). (f) Time-lapse AFM montages showing fold-changes in brain stiffness in representative control (top; OT axons outlined in blue) and mitotic inhibitor-treated embryos (bottom; OT axons in magenta). The colour scale encodes the fold-change in K at each location on the stiffness map, expressed relative to the values obtained at $t = 0$ minutes. (g) Plots of the fold-change over time in stiffness gradient (orange) and OT turn angle (blue) for both control and mitotic inhibitor-treated embryos. Blocking mitosis significantly attenuated the rise in both stiffness gradient ($p = 0.01$, linear regression analysis) and OT axon turning ($p = 0.01$). Boxplots show median, 1st, and 3rd quartiles; whiskers show the spread of the data; '×' indicates the mean. Error bars denote standard error of the mean. * $p < 0.05$. AFM measurement resolution, 20 μm ; scale bars, 100 μm . N denotes number of animals.

Supplementary Figures



Supplementary Figure 1: Custom-built support stand for the upright optical imaging set-up.

(a) Schematic (not to scale) of support stand and the adapter used to mount the upright fluorescence stereomicroscope to the stand. Codes denote part numbers (Thorlabs) where applicable. (b) Close-up photograph of the custom-built adapter shown in (a), with fluorescence stereomicroscope in place.



Supplementary Figure 2: Data processing for tiv-AFM experiments (same *Xenopus* embryo as in **Fig. 1d**). (a) Inverted epifluorescence raw images of OT axons (black) acquired during tiv-AFM measurements, labelled with membrane-bound GFP under the control of the cell type-specific *ath5* promoter. (b) Overlaid tiv-AFM-based stiffness maps, encoding raw values of apparent elastic moduli K , with OT axon outlines shown in blue. Black squares denote points where AFM data were not analysable. To generate the final stiffness maps used for mechanical gradient quantification, missing K values were interpolated and data were smoothed in x -, y -, and t - dimensions (*cf.* **Fig. 1d**; for more details see online methods). (c) Visualisation of fold-changes in brain tissue stiffness from one time point to the next, based on the interpolated and smoothed data shown in **Fig. 1d**. Colour scale encodes the fold-change in K at each location on the stiffness map, expressed relative to the values at the previous time point, with the exception of $t = 0$ minutes, where all values were set to 1. Tissue stiffness changed throughout the time course, with significant changes already occurring between ~40-80 minutes after the start of the experiment. AFM measurement resolution, 20 μm ; scale bar, 100 μm .