Chromatin accessibility dynamics of neurogenic niche cells reveal a reversible decline in

neural stem cell migration during aging

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Abstract

Aging is accompanied by a deterioration in the regenerative and repair potential of stem

cell regions in the brain. However, the mechanisms underlying this decline are largely unknown.

Here we profile the chromatin landscape of five different cell types freshly isolated from the

subventricular zone neurogenic niche of young and old mice. We find that chromatin states

exhibit distinct changes with aging in different cell types. Notably, the chromatin of quiescent

neural stem cells (NSCs) becomes more repressed with age whereas that of proliferative,

activated NSCs becomes more open. Surprisingly, these opposing age-related chromatin changes

involve cell adhesion and migration pathways. We experimentally validate that quiescent and

activated NSCs exhibit opposite migratory deficits during aging. Quiescent NSCs become more

migratory during aging, whereas activated NSCs and progeny become less migratory and less

able to mobilize out of the niche *in vivo* during aging. The cellular mechanism by which aging

impairs the migration of activated NSCs and progeny involves increased occurrence of force-

producing focal adhesions. Inhibiting the cytoskeletal-regulating kinase ROCK in old activated

NSCs and progenitors eliminates cell adhesive forces and boosts migration speed, reverting these

cells to a more youthful migratory state. Our work has important implications for restoring the

migratory potential of NSCs during aging and brain injury.

Main text

The adult brain contains regenerative neural stem cell (NSC) niches, with progenitors that

can migrate to distal brain regions to generate new neurons and glial cells[1]. The regenerative

potential of stem cell regions in the brain declines with age, and this is accompanied by a

corresponding deterioration in aspects of sensory and cognitive function and in repair ability[2-6].

The subventricular zone (SVZ) neurogenic niche provides an excellent paradigm for studying

NSC function and migration during aging. In this niche, quiescent NSCs line the ventricular

wall[7-9]. Quiescent NSCs can activate and in turn generate progenitors and neuroblasts that

migrate towards the olfactory bulb to produce new neurons[10]. Subventricular zone NSC progeny

also migrate to sites of injury to mitigate damage by generating new neurons[11] and astrocytes[12].

Both the regenerative potential and repair abilities of the SVZ neurogenic region deteriorate with

age[13-16]. But the mechanisms underlying regenerative decline during aging – and how defects in

migratory potential might be involved – remain largely unknown.

Epigenomic changes that affect chromatin states play an important role in the regulation

of cell fate[17] and aging[18]. So far, however, epigenomic studies of NSCs have been limited to

whole tissues *in vivo*[19] or to culture systems[20-22], and age-dependent epigenomic changes in

different cell types of the neurogenic niche *in vivo* are unknown. While several cellular and

signaling defects in neurogenic niches during aging have been uncovered by transcriptomic

studies[23-26], changes to the chromatin landscape of NSCs could have a longer-lasting impact on

the progeny and reveal features of aging that were previously undetected. Identifying chromatin

changes in different cell types from the neurogenic niche during aging could help reverse age-

dependent defects in regeneration and repair and counter brain aging.

The chromatin landscape of five cell types in the SVZ neurogenic region reveals opposing

chromatin changes with age in quiescent and activated NSCs involving cell adhesion and

migration pathways

To determine the impact of aging on the chromatin landscape of cells in the neurogenic

niche *in vivo,* we generated chromatin accessibility profiles from five distinct cell types freshly

isolated from the subventricular zone (SVZ) neurogenic niche of young and old mice. To this

end, we aged cohorts of transgenic mice expressing green fluorescent protein driven by the

promoter for glial fibrillary acidic protein (GFAP-GFP), which allows the isolation of different

cell types by fluorescent activated cell sorting (FACS)[27]. The SVZ neurogenic regions of young

(3-5 months old) and old (20-24 months old) GFAP-GFP mice were micro-dissected, and five

cell populations from this neurogenic niche were freshly isolated by FACS[27,28] – endothelial

cells, astrocytes, quiescent NSCs (qNSCs), activated NSCs (aNSCs), and neural progenitor cells

(NPCs) (Fig. 1a, Extended Data Fig. 1a). To assess chromatin accessibility genome-wide on

these rare cell populations (~100-1000 cells per individual), we used ATAC-seq[29-33] (Fig. 1a).

We verified that ATAC-seq libraries across all conditions exhibited stereotypical 147-bp

nucleosome periodicity (Extended Data Fig. 1b) and strong enrichment of accessibility around

transcription start sites (TSSs) (Extended Data Fig. 1c). Principal component analysis (PCA)

(Fig. 1b) and hierarchical clustering (Extended Data Fig. 2a) on accessible chromatin peaks

easily separated endothelial cells from other brain cells, and quiescent cells (astrocytes and

qNSCs) from activated ones (aNSCs and NPCs). The locus for *Ascl1*, a neural lineage gene

involved in NSC activation[34], shows accessible chromatin peaks in all neural cell types but not in

endothelial cells, and several chromatin peaks are higher in aNSCs and NPCs than in qNSCs and

astrocytes (Fig. 1c), consistent with *Ascl1* mRNA expression (Extended Data Fig. 2b).

Additionally, chromatin accessibility at promoters positively correlated with mRNA expression

genome-wide (Extended Data Fig. 2c). Thus, these genome-wide chromatin accessibility datasets

are of high quality and represent a useful resource for studying age-related chromatin changes in

5 different cell types freshly isolated from the regenerative SVZ neurogenic niche.

Chromatin accessibility allowed separation of quiescent and activated NSCs by age (Fig.

1d for PC3, Extended Data Fig. 3a for PC2). In line with transcriptional studies[25,26,28], more

chromatin peaks change with age in qNSCs (7,354) than in aNSCs (2,311) (FDR < 0.05)

(Extended Data Fig. 3b, Supplementary Table 3). But interestingly, chromatin accessibility could

separate young and old aNSCs whereas gene expression could not (Fig. 1d), suggesting that

analyzing chromatin states may reveal new genes and pathways that had not been previously

implicated in NSC aging. As expected, chromatin peaks were located either at promoters or at

intronic and distal regions, which are known to contain non-coding regulatory elements such as

enhancers (Fig. 1e). Performing PCA exclusively on distal and intronic chromatin peaks

(putative enhancer-containing sites) was sufficient to separate NSCs based on age (Fig. 1f,

Extended Data Fig. 3c,d), whereas chromatin accessibility at promoter regions alone was not

(Extended Data Fig. 3e), suggesting that non-coding regulatory elements may be particularly

sensitive to changes during aging.

Surprisingly, aging had opposing effects on chromatin accessibility dynamics in qNSCs

and aNSCs. While most dynamic peaks in activated cells open with age, most dynamic peaks in

quiescent cells closed with age (Fig. 1g). Likewise, the genome-wide chromatin landscape of old

aNSCs contained more accessible chromatin peaks but less nucleosomes than that of young

aNSCs while the opposite was true for qNSCs (Extended Data Fig. 3f,g). Chromatin peaks that

dynamically change with age in qNSCs and aNSCs were almost entirely distal or intronic

(Extended data Fig. 3h, Supplementary Table 3). Thus, the chromatin of activated NSCs

becomes more permissive with age while the chromatin of their quiescent counterparts becomes

more repressed, and these changes occur in putative enhancer-containing regions.

Gene Ontology (GO) biological pathway enrichment on qNSC and aNSC genes with

regulatory regions that exhibited differential accessibility with age revealed cell adhesion and

migration as defining hallmarks of aging in both qNSCs and aNSCs. Old qNSCs had decreased

chromatin accessibility at pathways involved in promoting cell adhesion and inhibiting cell

migration ("response to forskolin", "cAMP-mediated signaling", "negative regulation of cell

motility", "cell-cell adhesion (plasma membrane)" (Fig. 1h, Supplementary Table 4).

Conversely, old aNSCs had increased chromatin accessibility at regulatory regions of genes

associated with increased cell adhesion ("cell-cell adhesion (cadherins)", "homophilic cell

adhesion (plasma membrane)", "adherens junction organization") compared to young aNSCs

(Fig. 1i, Supplementary Table 4). Consistently, young qNSCs and old aNSCs were grouped

together based largely on cell adhesion pathways along the principal component 2 (PC2) axis

(Extended data Fig. 4a, Supplementary Table 6,7). These opposing changes in qNSCs and

aNSCs during aging are unlikely to be solely due to increased heterogeneity of cell populations

with age because they were also observed in scRNA-seq (Fig. 2d below) and *in vivo* brain

sections (Fig. 3a-c below). Thus, aging has opposing effects on the global chromatin landscape

of qNSCs and aNSCs, including changes to chromatin accessibility in regulatory regions

involved in cell adhesion and migration.

The opposing chromatin changes in old quiescent and activated NSCs with aging are

associated with functional defects in cell adhesion and migration

144   We next examined age-dependent changes in chromatin accessibility and mRNA

expression of specific genes involved in cell adhesion and migration. Old qNSCs freshly isolated

from the brain showed reduced chromatin accessibility at regulatory regions of cell adhesion

genes, including *Cdhr3* (Cadherin Related Family Member 3) (Fig. 2a, b). In contrast, old aNSCs

exhibit increased chromatin accessibility at regulatory regions of cell adhesion genes, including

cadherins and *Pcdh18* (proto-cadherin 18) (Fig. 2a, b), overlapping with a number of adhesion

genes enriched in young qNSCs (Extended Data Fig. 4b). Old NPCs also exhibit increased

accessibility at adhesion pathways with age (Extended Data Fig. 4c, Supplementary Table 4),

indicating that some of these age-related changes are preserved in downstream progeny. Motif

enrichment analysis using a deep learning approach (DeepLift[35] and TF-MoDISCO[36,37], see

Methods) identified the motifs for NFI transcription factors NFIB and NFIC among the most

enriched within the differentially accessible chromatin regions that close with age in qNSCs and

open with age in aNSCs freshly isolated from the brain (Fig. 2c). The NFI transcription factor

family regulates cellular adhesion pathways in NSCs[20], and NFI isoforms affect cellular

migration[38]. Hence, open chromatin dynamically changes in an opposing manner at regulatory

regions of genes that contain binding sites for a key cell adhesion transcription factor.

Importantly, re-analysis of single-cell RNA-seq from the young and old neurogenic SVZ niche[25]

showed that old qNSCs/astrocytes have decreased expression of genes involved in cell adhesion

pathways compared to their young counterparts while old aNSCs/NPCs exhibit increased

expression of cell adhesion genes compared to their young counterparts (Fig. 2d). Furthermore,

changes in NSC adhesion during aging are unlikely to be explained solely by differences in cell

cycle status, as cell adhesion and cell cycle signatures could be uncoupled at the single cell level

(Extended Data Fig. 5). Thus, in quiescent and activated NSCs, aging leads to opposing changes

in the chromatin accessibility and mRNA expression of genes involved in cell adhesion.

Our chromatin dynamics results predict that the adhesive properties of NSCs change with

age. To directly test if aging functionally impacts the migratory properties of NSCs in an

opposing manner, we used a culture system for quiescent NSCs and proliferative NSCs (a mix of

aNSCs/NPCs)[20,28,39-41](Fig. 2e,f). We verified that the chromatin landscape of cultured NSCs was

similar to that of freshly isolated NSCs (Extended Data Fig. 6a-e, Supplementary Tables 3,4,5),

notably in its age-related changes to cell adhesion and migration pathways (Fig. 2g,h). To

quantify NSC migration in culture, we performed continuous live-cell imaging of cultured NSCs

over the course of 20 hours (Fig. 2i). Interestingly, old qNSCs were slightly more migratory (less

adhesive) compared to their young counterparts (mean velocities: young (2.998 μm/hr) vs. old

(3.465 μm/hr)) (Fig. 2j, Extended Data Fig 6f), whereas old aNSCs/NPCs were less migratory

(more adhesive) compared to their young counterparts (mean velocities: young (13.618 μm/hr)

vs. old (9.928 μm/hr)) (Fig. 2k, Extended Data Fig. 6g). Quantifying the migration of cultured

aNSCs/NPCs through Matrigel, a hydrogel composed of extracellular matrix (ECM) proteins,

confirmed that aNSCs/NPCs cultured from old brains exhibit impaired migration through ECM

compared to their young counterparts (Fig. 2l,m). Hence, aging has opposing effects on the

adhesive and migratory properties of quiescent and activated NSCs in culture, with qNSCs

becoming less adhesive and aNSCs/NPCs becoming more adhesive in old age.

Age-dependent cell adhesion and migration defects of quiescent and activated NSCs and

progenitors *in vivo*

189   Quiescent NSCs line the ventricles and can become activated (aNSCs) to give rise to

neural progenitors (NPCs) and neuroblasts that migrate along the rostral migratory stream (RMS)

to the olfactory bulb (OB)[10,42,43]. While neuroblast migration has begun to be examined in older

animals[44-47], the adhesive and migratory properties of quiescent and activated NSCs and their

progenitors *in vivo* during aging remain largely unstudied. As adhesion to the niche plays a key

role in regulating NSC stemness and function[48], we assessed quiescent and activated NSC

localization *in vivo* by immunostaining of coronal brain sections from young and old individuals

(Fig. 3a,b). In old brains, quiescent NSCs and niche astrocytes (GFAP+/Ki67-) were located

further away from the ventricle, while activated NSCs (GFAP+/Ki67+) were located closer to

the ventricle than in young brains (Fig. 3c). Together with functional data from cultured NSCs

(Fig. 2), these results suggest that quiescent NSCs become less adherent to the ventricle while

activated NSCs become more adherent during aging.

202   We next probed the migratory properties of activated NSCs and progeny during aging *in*

vivo. To this end, we injected young and old mice with the thymidine analog 5-Ethynyl-2'-

deoxyuridine (EdU), which incorporates into the DNA of replicating cells, to label and trace

activated NSCs and their progeny. We assessed the number of EdU-positive (EdU+) cells in the

SVZ niche, the migration route (RMS), and destination (OB), at a short (4 hours), mid- (2 days),

or long (7 days) time point after EdU injection (Fig. 3d-f, Extended Data Fig. 7a). While

successive rounds of cell division can dilute EdU signal[49], nucleoside analogs have been used to

study SVZ neurogenesis in longer time frames (31 days)[16]. In young individuals, EdU+ cells

were numerous in the niche and along the RMS 4 hours after EdU injection (Fig. 3g,h). After 7

days, young animals showed a dramatic reduction of EdU+ cells in the niche and RMS, and a

corresponding increase in EdU+ cells in the OB, consistent with mobilization out of the niche

and clearance from the RMS towards the OB (Fig. 3g-i). In old individuals, EdU+ cells were less

numerous, as expected[15,16,50,51] (Fig. 3f, Extended Data Fig. 7b), but they neither significantly

decreased in the SVZ niche after 7 days (Fig. 3j) nor increased in the OB after 7 days (Fig. 3l). In

the aged neurogenic niche, old EdU+ aNSCs/NPCs and neuroblasts (Extended Data Fig. 7c)

were located closer to the ventricle, after a 4 hour EdU pulse, than their young counterparts (Fig.

3m-o). These observations are consistent with an inability of old aNSCs and progeny to mobilize

out of the old neurogenic niche. We did observe some clearance of EdU+ cells through the old

RMS after 7 days (Fig. 3k), suggesting that old neuroblasts retain some motility in the RMS[44],

but migrate more slowly than young neuroblasts. Thus, aging impairs the tight localization of

quiescent NSCs to the ventricles and decreases the migratory ability of old aNSCs and

downstream progeny (NPCs and neuroblasts) to their distal destination *in vivo*.

Aging increases the occurrence of force-producing focal adhesions in aNSCs/NPCs

We assessed the cellular mechanisms underlying the decrease in migratory properties of

aNSCs and progenitors, and their increased cell adhesion, during aging. Adhesion of cells to the

extracellular matrix (ECM) primarily involves integrin-mediated linkage between ECM and actin

cytoskeleton (Fig. 4a). We first used immunofluorescence staining to visualize the F-actin

cytoskeleton and quantify bundled actin, which contributes to cellular adhesion through the

formation of stress fibers, lamellipodia, and filopodia[52,53]. Activated NSCs/NPCs cultured from

old brains exhibited increased staining for bundled actin compared to young counterparts (Fig.

4b,c). Thus, the age-related migratory deficit of old cultured aNSCs/NPCs is accompanied by

increased cytoskeletal assembly, which is necessary for integrin-based adhesion to the ECM.

To directly visualize the mechanical forces imparted by aNSCs/NPCs interacting with

their substrate, we next leveraged Förster resonance energy transfer (FRET)-based molecular

tension sensors (Fig. 4a)[54,55]. Molecular tension sensors reveal forces exerted by aNSCs/NPCs on

surfaces coated with synthetic arginine-glycine-aspartate (RGD) peptides known to bind

integrins and mediate adhesion[55], with higher forces corresponding to a reduction in FRET (Fig.

4a). FRET measurements revealed that aNSCs/NPCs primarily exert force though distinct focal

adhesion complexes at their periphery (Fig. 4d). Consistently, bundled actin also aggregated

peripherally in aNSCs/NPCs (Extended Data Fig. 8a). We quantified the adhesive force patterns

for young and old cultured aNSCs/NPCs and found that their focal adhesion profiles were

bimodal, with a population of cells exhibiting force-producing focal adhesions and a population

with no force-producing focal adhesions (Fig. 4e,f). While aging does not significantly affect

individual focal adhesion strength or area (Fig. 4e, Extended Data Fig. 8b), old aNSCs/NPCs

were more likely to exhibit force-producing adhesions than young aNSCs/NPCs (Fig. 4f,

Extended Data Fig. 8c-e) (P=0.0327, combined Fisher's exact test). Specifically, old

aNSCs/NPCs were much more likely than young aNSCs/NPCs to exhibit force-producing

adhesions when in contact with other cells (Extended Data Fig. 8f,g). Thus, a higher prevalence

of force-producing adhesions in old aNSCs/NPCs likely contributes to the functional

deterioration in the migration of activated NSCs and their progeny in the aged brain.

Inhibition of ROCK boosts migration speed and eliminates focal adhesions in aNSCs/NPCs

from aged brains

To identify a molecular target to modulate and potentially reverse the age-related

migratory deficit of old activated NSCs and progenitors, we used Ingenuity Pathway Analysis

(IPA) to enrich for signaling pathways associated with the chromatin accessibility changes seen

in old aNSCs/NPCs. Pathway enrichment by IPA revealed a number of signaling pathways

including some involved in cell adhesion (Fig. 5a, Supplementary Table 8), consistent with our

GO analysis (see Fig. 1i). The most enriched pathway in this cluster was Gα 12/13 signaling

(Fig. 5a), which regulates cell adhesion in part via Rho and Rho-associated protein kinase

(ROCK)[56,57] (Fig. 5b). ROCK plays a major role in regulating the actin cytoskeleton and cell

adhesion (among other phenotypes)[58], and it could serve as a molecular target to reverse the age-

dependent decline in aNSC/NPC migration.

To determine if the migratory properties of old aNSCs and their progenitors could be

ameliorated via modulation of the ROCK pathway, we targeted ROCK with the small molecule

inhibitor Y-27632[59-66] in cultured aNSCs/NPCs. Quantification of force patterns on RGD

molecular tension sensors (Fig. 5c) revealed that treating old aNSCs/NPCs with the ROCK

inhibitor Y-27632 eliminated force-producing focal adhesions (Fig. 5d,e). Consistently,

inhibiting ROCK in old aNSCs/NPCs also resulted in decreased staining for bundled actin (Fig.

5f,g). ROCK inhibition resulted in improved migration speed in both young and old

aNSCs/NPCs (mean velocities: young (13.618 μm/hr) vs. young + Y-27632 (20.201 μm/hr); old

(9.928 μm/hr) vs. old + Y-27632 (21.691 μm/hr)) (Fig. 5h,i, Extended Data Fig. 8h,

Supplementary Videos 1,2). Furthermore, inhibiting ROCK rescued the age-related decline in

old aNSC/NPC migration through ECM (Fig. 5j). Together, these data indicate that inhibition of

the ROCK pathway could ameliorate the age-related migratory deficit of old aNSCs and

progenitors for neurogenesis and repair targets.

Discussion

Our study is the first to identify age-related genome-wide changes to the global

chromatin landscape of quiescent and activated NSCs freshly isolated from the adult SVZ

neurogenic niche. This analysis reveals that aging has opposing effects on the opening and

closing of dynamic chromatin regions in quiescent and activated NSCs, with many of these

changes affecting adhesion and migration pathways. Our study also shows for the first time that

old activated NSCs and progenitors exhibit impaired migration, and that ROCK inhibition boosts

the migratory ability of these cells in culture partly by decreasing the formation of force-

producing adhesions. This work could uncover new strategies to restore age-dependent defects in

regeneration and repair by targeting adhesive and migratory changes with age.

The chromatin landscape of quiescent NSCs becomes less open with age whereas that of

activated NSCs becomes more open with age. The closing of chromatin regions with age in

quiescent NSCs is consistent with findings of increased age-related repressive chromatin marks

such as H3K27me3 in other quiescent stem cells[67], including quiescent muscle satellite cells[68,69]

and hematopoietic stem cells[70]. The chromatin landscape of activated NSCs generally becomes

more permissive with age, consistent with the observation that reducing the repressive 5-

hydroxymethylcytosine (5hmC) mark in hippocampal NPCs mimics age-dependent defects[19].

Moreover, it is interesting to note that age-related chromatin changes are readily detectable in

activated NSCs, yet transcriptomic changes are very limited in these cells[25,26,28] and other cellular

systems[70-72]. Because the majority of dynamic chromatin changes that occur with age in NSCs

impact distal and intronic regulatory sites, which likely contain non-coding regulatory elements

such as enhancers, age-related chromatin changes in aNSCs may underlie longer-lasting changes

and manifest themselves transcriptionally more in downstream progenitors.

Cell adhesion emerged as a hallmark of NSC aging in our study. The migratory

properties of neuroblasts has started to be examined with age[44-47] and in the context of

innervating distal tumors[73]. But the changes in migration and adhesion in quiescent and activated

NSCs, the upstream NSC populations that give rise to migratory neuroblasts, remain largely

unknown. Our study reveals a dichotomy between changes to the adhesive/migratory properties

of quiescent and activated NSCs with age. As mechanical cell deformations affect the nucleus

and chromatin itself[74,75], epigenomic profiling might be especially sensitive to identifying

changes in the regulation of adhesion and migration in stem cells and their progeny.

A key question is the role of intrinsic factors vs. extrinsic factors in cell migration with

age. Age-related changes to the biomechanical properties of regenerative niches, such as

stiffness, have been shown to extrinsically induce age-related phenotypes[76]. Our findings in

cultured aNSCs/NPCs highlight the importance of intrinsic changes to cellular adhesion

pathways that change with age. Notably, aNSCs/NPCs isolated from an old brain retain

migratory impairment and increased occurence of force-producing adhesions even when

removed from the extrinsic effects of the niche. Understanding the contribution of intrinsic and

extrinsic responses, and how they influence each other during aging, will be critical to identify

strategies to boost regeneration and repair during aging.

Inhibiting Rho-associated kinase (ROCK), a regulator of cytoskeletal dynamics[57], with

the small molecule Y-27632 improves motility in aged activated NSCs and downstream

progenitors. Inhibition of ROCK has a profound impact on migration in a variety of cells,

including myoblasts, glioma cells, and microglia with different effects[77-84]. However, ROCK

inhibition has previously not been tested in aNSCs/NPCs during aging, and its effects on young

aNSCs/NPCs remain unclear: one study of human embryonic stem cell (ESC)-derived NSCs

showed decreased migration speed upon ROCK inhibition[85], while another study of NSCs

derived from postnatal and young adult mice showing increased migration speed upon ROCK

inhibition[64]. Here we show that ROCK inhibition eliminates focal adhesions and increases

migration in old aNSCs/NPCs. While ROCK has pleiotropic roles in aspects other than migration

(e.g. autophagy, apoptosis, vesicle dynamics, etc.), this protein kinase is a promising potential

target in the aging brain to restore aspects of migration notably in cases of injury and

neurodegenerative disease[86]. ROCK inhibitors are well tolerated in humans and have begun to be

studied in the context neurodegenerative disease[86] and could potentially be used to ameliorate

other age-dependent defects. Our study could help identify ways to restore proper migration of

NSCs and progenitors in the aging brain and in the context of brain injury.

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Authors contributions

R.W.Y. and A.B. planned the study. R.W.Y. performed and analyzed all experiments, except for

those indicated below. O.Y.Z. generated sections, performed immunostaining, and quantification

for all *in vivo* experiments and participated in the planning of the study. B.Z. performed the RGD

tension sensor experiments and analyzed the FRET data supervised by A.D.. M.S. generated the

NSC deep learning model and performed motif enrichment supervised by A.K.. T.R. assisted in

the *in vivo* NSC migration study. A.K. and A.D. also provided intellectual contribution. R.W.Y.

and A.B. wrote the manuscript, with help from O.Y.Z., and all authors provided comments.

Competing Interests

The authors declare no competing interests.

Data availability

All raw sequencing reads and processed bam files for ATAC-seq libraries can be found under

BioProject PRJNA715736.

Code availability

The code used to analyze genomic data in the current study are available in the Github repository

for this paper (https://github.com/brunetlab/Yeo_RW_NSC_ATACseq).

Methods

Laboratory animals

For *in vivo* ATAC-seq libraries and immunofluorescence experiments with coronal sections, an

equal number of male and female GFAP-GFP (FVB/N background) mice[87] were pooled and

used. For ATAC-seq libraries generated from cultured NSCs, the SVZs from one male and one

female C57BL/6 mouse obtained from the NIA Aged Rodent colony were pooled and used. For

all other experiments, male C57BL/6 mice obtained from the NIA Aged Rodent colony were

used. In all cases, mice were habituated for more than one week at Stanford before use. At

Stanford, all mice were housed in either the Comparative Medicine Pavilion or the Neuro

Vivarium, and their care was monitored by the Veterinary Service Center at Stanford University

under IACUC protocols 8661.

ATAC-seq library generation from freshly isolated cells

We used fluorescence-activated cell sorting (FACS) to freshly isolate populations of endothelial

cells, astrocytes, quiescent NSCs (qNSCs), activated NSCs (aNSCs), and neural progenitor cells

(NPCs) from GFAP-GFP (FVB/N background) animals[87], as previously described[28]. Briefly, we

micro-dissected and processed the subventricular zones from young (3-5 months old) and old

(20-24 months old) GFAP-GFP mice following the previously described protocol[27] with the

addition of negative gating for CD45 (hematopoietic lineage) and sorting of endothelial cells

(CD31+) as previously described[28] (see Extended Data Fig. 1a). All FACS sorting was

performed at the Stanford FACS facility on a BD Aria II sorter, using a 100-μm nozzle at 13.1

pounds/square inch (psi), and Flowjo (v8) software was used for data analysis. Due to the rarity

of NSC lineage cells, we pooled sorted cells from 2 young male and 2 young female GFAP-GFP

mice for the young conditions (3-5 months old), and from 3 old male and 3 old female GFAP-

GFP mice for the old conditions (20-24 months old). For each respective library, we sorted either

2000 astrocytes, 2000 qNSCs (with the exception of a single library which only had 1670 cells),

800-1000 aNSCs, 2000 NPCs, or 2000 endothelial cells from GFAP-GFP animals for ATAC-seq

(see Supplementary Table 2). Young and old cells of the five cell types were sorted into 150 μL

of NeuroBasal-A medium (Gibco, 10888-022) with penicillin-streptomycin-glutamine (Gibco,

10378-016) and 2% B27 minus vitamin A (Gibco, 12587-010) in a 96-well V-bottomed plate

(Costar, 3894) and spun down at 300g for 5 min at 4°C. Sorted cells were washed with 100 μL

ice-cold 1x PBS (Corning, 21-040-CV), male and female cells were pooled by age and cell type,

and then spun down at 300g for 5 min at 4°C. Next, 50 μL of lysis buffer (10 mM Tris HCl pH

7.4 (Sigma, T2194), 10 mM NaCl, 3 mM $MgCl_2$ (Ambion, AM9530G), 0.10% NP-40 (Thermo,

85124)) was added to each well (alternating between young and old wells) and was immediately

spun down at 500g for 10 min at 4°C. Lysis buffer was carefully aspirated and 5 μL of

transposition mix (2.5 μL 2x Tagment DNA (TD) buffer, 2.25 μL nuclease-free H_2O, 0.25 μL

Tn5 transposase (Illumina, FC-121-1030)) was added to each well and pipetted 6x to resuspend

nuclei. Cells were incubated for 30 min at 37°C in a sealed 96-well plate and then briefly spun

down at 500g for 1 min to account for evaporation. Transposed DNA was then purified using the

Zymo DNA Clean & Concentrator kit (Zymo, D4014) and eluted in 20 μL of nuclease-free H_2O.

PCR amplification and subsequent qPCR monitoring was performed as previously described in

the original ATAC-seq protocol[29]. ATAC-seq libraries from young and old cells were amplified

with 11-14 PCR cycles and then purified using the Zymo DNA Clean & Concentrator kit (Zymo,

D4014) and eluted in 15 μL of nuclease-free H_2O. See below "*Library sequencing and ATAC-*

seq quality control of in vivo and cultured NSCs" for details on sequencing of ATAC-seq

libraries.

Primary NSC cell culture

To obtain primary cultures of adult NSCs for ATAC-seq, we micro-dissected and pooled SVZs

from pairs of male and female C57BL/6 mouse at a young age (3 months old) or an old age (23

months old) obtained from the NIA. To obtain primary cultures of adult NSCs for

immunofluorescence staining, migration assays, and force sensor assays, we micro-dissected the

SVZs from a single young C57BL/6 male (3-5 months old) or a single old C57BL/6 male (20-24

months old) obtained from the NIA (see Supplementary Table 1). In both cases, micro-dissected

SVZs were finely minced, suspended in 5 mL of PBS +0.1% Gentamicin (Thermo Fisher,

15710064) and spun down at 300g for 5 min at room temperature. We then dissociated SVZs by

enzymatic digestion using 5 mL of HBSS (Corning, 21-021-CVR) with 1% penicillin-

streptomycin-glutamine (Gibco, 10378-016), 1 U/mL Dispase II (STEMCELL Technologies,

07913), 2.5 U/mL Papain (Worthington Biochemical, LS003126), and 250 U/mL DNAse I

(D4527, Sigma-Aldrich), vortexed briefly, and left at 37°C for 40 min on a rotator. Following

digestion, the samples were spun down at 300g for 5 min at room temperature and resuspended

in 5 mL of NeuroBasal-A medium (Gibco, 10888-022) with 1% penicillin-streptomycin-

glutamine (Gibco, 10378-016) and 2% B27 minus vitamin A (Gibco, 12587-010) and triturated

repeatedly (20x) with 2-3 washes. Single-cell suspensions were then resuspended in "complete

activated media": Neurobasal-A (Gibco, 10888-022) supplemented with 2% B27 minus vitamin

A (Gibco, 12587-010), 1% penicillin–streptomycin–glutamine (Gibco, 10378-016), 20 ng/mL of

EGF (Peprotech, AF-100-15), and 20 ng/mL of bFGF (Peprotech, 100-18B). For passaging, cells

were dissociated with 1 mL Accutase (STEMCELL Technologies, 07920) for 5 min at 37°C,

washed once with 5 mL 1x PBS, and resuspended in "complete activated media" for expansion.

For quiescent conditions, quiescence was induced over 5-10 days by replacing "complete

activated media" with "complete quiescent media": Neurobasal-A (Gibco, 10888-022)

supplemented with 2% B27 minus vitamin A (Gibco, 12587-010), 1% penicillin–streptomycin–

glutamine (Gibco, 10378-016), 50 ng/mL of BMP4 (Biolegend 94073), and 20 ng/mL of bFGF

(Peprotech, 100-18B). For adherent cultures, we coated plates with PBS+Poly-D-Lysine (Sigma-

Aldrich, P6407, 1:20) for 30-120 min at 37°C, and washed plates 4x with 1x PBS prior to

seeding cells. All cell counting was performed using the Countess II FL Automated Cell Counter

(Life Technologies, AMQAF1000).

ATAC-seq library generation from cultured NSCs

To establish individual primary NSC cultures for ATAC-seq, we dissected and pooled the SVZs

from one male and one female C57BL/6 NIA mouse from either a young cohort (3 months old)

or an old cohort (23 months old). We dissociated and cultured NSCs as described above (in the

section "*Primary NSC cell culture*") to generate 4 young and 4 old biological replicates. At

passage 5, NSCs were plated at a density of 1.2 million cells per 6cm PDL-coated plate in

complete quiescent media for 8 days prior to sorting. At passage 7, NSCs from the same culture

were plated at a density of 1.5 million cells per 6cm plate onto PDL-coated plates in complete

activation media for 24 hours prior to sorting to synchronize quiescent and activated sorting

experiments. Plates were washed 3x with 1x PBS. Adherent qNSCs were lifted from the plate

using 1 mL of Accutase (STEMCELL Technologies, 07920) for 15 min at 37°C and adherent

aNSCs/NPCs were lifted from the plate using 1 mL of Accutase (STEMCELL Technologies,

07920) for 5 min at 37°C. The Accutase (STEMCELL Technologies, 07920) cell suspension was

diluted with 10 mL of 1x PBS, cells were spun down at 300g for 5 min, then resuspended in 200

μL of Neurobasal-A (Gibco, 10888-022) supplemented with 2% B27 minus vitamin A (Gibco,

12587-010), 1% penicillin–streptomycin–glutamine (Gibco, 10378-016) with propidium iodide

(BioLegend, 421301, 1:5000) for live/dead staining. Cells were kept on ice during all subsequent

steps.

Due to concern about differing levels of dead cells in the young vs. old cultures as well as the

contaminating influence of dead cells on ATAC-seq libraries, all samples were sorted using

fluorescence-activated cell sorting (FACS) based on the live gate (propidium iodide).

Specifically, 10,000-15,000 live cultured qNSCs and aNSCs/NPCs (see Supplementary Table 2)

were respectively sorted into 100 μL of NeuroBasal-A medium (Gibco, 10888-022) with

penicillin-streptomycin-glutamine (Gibco, 10378-016) and 2% B27 minus vitamin A (Gibco,

12587-010) in a 96-well V-bottomed plate (Costar, 3894) and spun down at 300g for 5 min at

4°C. Sorted cells were washed with 100 μL ice-cold 1x PBS (Corning, 21-040-CV), and spun

down at 300g for 5 min at 4°C. 50 μL of lysis buffer (10mM Tris HCl pH 7.4 (Sigma, T2194),

10mM NaCl, 3mM $MgCl_2$ (Ambion, AM9530G), 0.10% NP-40 (Thermo, 85124)) was added to

each well (alternating between young and old wells) which were immediately spun down at 500g

for 10 min at 4°C. Lysis buffer was carefully aspirated and 50 μL of transposition mix (12.5 μL

4x Tagment DNA (TD) buffer (gift from the Chang Lab), 35 μL nuclease-free H_2O, 2.5 μL Tn5

(gift from the Chang Lab)) was added to each well and pipetted 6x to resuspend nuclei. Cells

were incubated for 30 min at 37°C in a sealed 96-well plate and then briefly spun down at 500g

for 1 min to account for evaporation. Transposed DNA was then purified using the Zymo DNA

Clean & Concentrator kit (Zymo, D4014) and eluted in 20 μL of nuclease-free H_2O. PCR

amplification and subsequent qPCR monitoring was performed as previously described in the

original ATAC-seq protocol[29]. All libraries were amplified for 5 PCR cycles, and then an

additional 4 PCR cycles (based off of qPCR amplification curves), and then purified using the

Zymo DNA Clean & Concentrator kit (Zymo, D4014) and eluted in 15 μL of nuclease-free H_2O.

Library sequencing and ATAC-seq quality control of *in vivo* and cultured NSCs

We quantified individual library concentrations using a Bioanalyzer (High Sensitivity) and

pooled at a concentration of 5 nM for sequencing. Multiplexed libraries were sequenced using

NextSeq (400M) by the Stanford Functional Genomics Facility. To assess individual library

quality, individual library paired-end FASTQ files were processed using the Kundaje Lab's

ATAC-seq Pipeline (https://github.com/kundajelab/atac_dnase_pipelines) with default

parameters (using "-species mm10" and including "-auto_detect_adapter").

For *in vivo* ATAC-seq libraries generated from freshly isolated SVZ cells, libraries were

excluded based on insufficient read coverage (<10 million unique reads) or low peak calling

(<=20,000 peaks). In general, endothelial cell libraries were of worse quality than the other four

sorted cell types and we additionally censored one endothelial library with low bowtie alignment

(~92%) since all other libraries had a bowtie alignment of >= 95%.The high-quality libraries

were sequenced to a mean read depth of 29,187,427 unique reads (ranging from ~10-69 million

reads per library) (see Supplementary Table 2).

In general, ATAC-seq library quality was much better for cultured NSCs than freshly isolated

NSCs so we used a different set of metrics for quality control. For cultured NSCs, 1 library (out

of 4) from each condition was excluded to due to poor quality, defined as the library with the

lowest transcription start site (TSS) enrichment (<20 in all cases). Additionally, both young and

old quiescent cultures had one library that appeared highly anomalous (~2-fold greater fraction

of reads in peaks (FRiP) and TSS enrichment compared to every other library) so they were

additionally excluded to not confound results. The remaining 2-3 high-quality libraries per

condition were sequenced to a mean read depth of 26,271,688 unique reads (ranging from ~18-

42 million reads per library) (see Supplementary Table 2).

ATAC-seq pipeline and processing

Libraries that passed quality control were re-processed using the Kundaje Lab's ATAC-seq

Pipeline starting from de-duplicated BAM files to call peaks per multi-replicate condition. De-

duplicated, Tn5-shifted tagAlign files for each replicate were converted to BAM files (using

bedToBam (v2.29.2)) and sorted (using samtools sort (v1.10)) for downstream analysis. Peaks

per multi-replicate condition were selected using "overlap > optimal set" resulting in

approximately 20,000-90,000 peaks per *in vivo* condition (with a mean peakset size of 65,243

peaks) and approximately 90,000-150,000 peaks per cultured NSC condition (with a mean

peakset size of 118,987 peaks). To generate pooled read libraries, the 2-3 high-quality filtered,

de-duplicated BAM files for each condition were merged (using samtools merge (v1.10)), sorted

(using samtools sort (v1.10)), tn5-shifted (using deepTools alignmentSieve (v3.4.3)), and

indexed (using samtools index (v1.10)). All analysis was performed using the *mm10* mouse

genome ("TxDb.Mmusculus.UCSC.mm10.knownGene").

Transcription start site (TSS) enrichment

Transcription start site (TSS) enrichment heatmaps were generated with ngsplot.R (version

2.6.1)[88] using pooled, Tn5-shifted, sorted BAM files as inputs for each of the 10 conditions. All

analysis was performed using the *mm10* mouse genome

("TxDb.Mmusculus.UCSC.mm10.knownGene").

Generating consensus peaksets and count matrices

To generate consensus peaksets for downstream analysis, BAM files and multi-replicate peak

files were loaded into a Large DBA object using Diffbind (v2.10.0)[89,90] "dba.count" with

parameters "minOverlap=0" and "score=DBA_SCORE_READS". We annotated peaks in the

consensus count matrices using the "annotatePeak" function of the package ChIPSeeker

(v1.18.0)[91] with parameters "tssREgion=c(-3000,3000)".

Functional enrichment of genetic elements within global peaksets

The "annotatePeak" function of ChIPSeeker (v1.18.0)[91] was used to identify the genetic element

identity of each chromatin peak within the multi-replicate peakset for each condition with

parameters (tssRegion=c(-3000, 3000), annoDb="org.Mm.eg.db"), and the annotation statistics

were extracted using "@annoStat". The different promoter terms "Promoter (<=1kb)",

"Promoter (1-2kb)", and "Promoter (2-3kb)" were manually grouped together under "Promoter",

and the two intron terms were manually grouped under "Intron".

Principal Component Analysis (PCA)

DESeq2 (v1.22.2)[92] was used to calculate dispersion estimates from raw consensus count

matrices and then variance stabilizing transformations were applied prior to visualization by

principal component analysis.

For *in vivo* ATAC-seq libraries generated from freshly isolated SVZ cells, PCA on all chromatin

peaks was generated using the global consensus peakset of 141,970 peaks. PCA consisting of all

young and old qNSC and aNSC libraries was generated using the count matrix consisting of

these 87,796 peaks. Based on peak annotations, the NSC consensus peakset was sub-divided into

a distal peakset (31,660 peaks), an intronic peakset (28,571 peaks), a promoter peakset (20,633),

and a putative enhancer (distal+intronic) peakset (60,231 peaks). For ATAC-seq libraries

generated from cultured NSCs, PCA was generated from the consensus peakset with 121,497

peaks. To compare how cultured NSCs compared to NSCs freshly isolated from the SVZ, we

performed PCA on the count matrix consisting of the 11 freshly isolated NSC libraries and the

10 cultured NSC libraries (156,963 peaks).

Clustering freshly isolated ATAC-seq libraries for heatmap visualization

To cluster and visualize all ATAC-seq libraries from freshly isolated SVZ cell populations

together, we generated a heatmap from the global consensus peakset (141,970 peaks) with

"cor()" using the default Pearson's correlation with the R library "pheatmap" (v1.0.12).

Correlating ATAC-seq promoter accessibility and RNA-seq expression

For young and old qNSCs and aNSCs freshly isolated from the SVZ, the average (VST-

normalized) chromatin accessibility value of each gene's promoter was associated with the

average (VST-normalized) RNA-seq[28] expression value for that gene. Promoters were binned in

deciles based on promoter accessibility and the association between promoter chromatin

accessibility and associated genic mRNA expression was plotted as deciled boxplots using R

(v3.5.2).

Chromatin signal track visualization for freshly isolated NSCs

Alignment tracks were visualized using IGV (v2.4.19). For each condition, the BAM file for a

single representative library (see Supplementary Table 2) was normalized by Reads per Kilobase

per Million mapped reads (RPKM-normalization) and converted to a bigwig file using deepTools

(v3.4.3) with the following parameters: "--extendReads 100 --normalizeUsing RPKM --binSize

10".

Differential peak calling

To identify differentially accessible peaks that change with age for each cell type, count matrices

consisting of young and old replicates within a single cell type were generated using Diffbind

(v2.10.0)[89,90] as described above (see *Generating consensus peaksets and count matrices*).

Differential peak calling was accomplished using EdgeR (v3.24.3)[93,94] with the following

parameters for "dba.analyze": bCorPlot=FALSE, bParallel=TRUE, bTagwise=FALSE,

bFullLibrarySize=TRUE, bReduceObjects=FALSE,method=DBA_EDGER". For all

comparisons, differential peaks were obtained using a false discovery rate (FDR) threshold of

0.05 (see Supplementary Table 3). Differential peaks were annotated and associated with their

closest gene using the "annotatePeak" function of the package ChIPSeeker (v1.18.0)[91] with

parameters "tssREgion=c(-3000,3000)". For the differential peaks that change with age in the

freshly isolated qNSC and aNSC libraries respectively, differential peaks were aligned to the

mm10 chromosomes using the "covplot()" function in ChIPSeeker (v1.18.0)[91] for ease of

visualization. It should be noted that the opposing directionality of dynamic peak changes with

age was only observed in freshly isolated qNSCs and aNSCs (whereas cultured qNSCs and

aNSCs/NPCs both generally show an opening of chromatin peaks with age).

Functional enrichment of genetic elements within differential NSC peaksets

The differentially accessible peaks that change with age in the freshly isolated qNSC and aNSC

conditions respectively were separated into sets that close with age or open with age and were

annotated with the "annotatePeak" function of ChIPSeeker (v1.18.0)[91] with parameters

(tssRegion=c(-3000, 3000), annoDb="org.Mm.eg.db"). The annotation statistics from

"@annoStat" were manually grouped into 4 categories: "Distal Intergenic", "Intron",

"Promoter", and "Other".

Nucleosome peak calling

To identify whether the chromatin landscapes of young and old freshly isolated qNSCs and

aNSCs had different levels of heterochromatin-associated nucleosomes, we used the package

NucleoATAC (v0.2.1)[95]. We called nucleosome peaks from our ATAC-seq data using

"nucleoatac run" with parameters: "--bed" the multi-replicate peak files for each condition, "--

bam" pooled, down-sampled (to 30 million unique reads), Tn5-shifted BAM files, and "--fasta"

the mm10 Mus musculus UCSC genome. The number of nucleosome peaks for each condition

were taken from the "*.nucmap_combined.bed" files and plotted with R (v3.5.2).

Gene Ontology (GO) Biological Pathway Enrichment of differentially accessible chromatin

peaks

Differentially accessible peaks were associated with nearby genes using the ChIPSeeker

(v1.18.0)[91] function "annotatePeak". Gene lists were uploaded to the online tool EnrichR[96,97] and

top ranked GO terms from "GO Biological Process 2018" were extracted for pathways that

change with age (see Supplementary Table 4). Selected GO terms were ranked by *P*-value and

plotted for visualization in R (v3.5.2).

Gene Ontology (GO) Biological Pathway Enrichment of genes driving PC axes

In order to identify what biological processes were associated with peaks driving the principal

components (PCs) in the PCA of young and old freshly isolated qNSCs and aNSCs, the top 1000

peaks driving the principal components (either negatively or positively) were extracted and

associated with genes (see Supplementary Table 6). The genes (under header "Symbol")

associated with these peaks were uploaded to EnrichR to identify top ranked GO terms from

"GO Biological Process 2018" (see Supplementary Table 7). The top 6 GO terms for PC2

negative peaks (grouping old qNSCs and young aNSCs) and PC2 positive peaks (grouping

young qNSCs and old aNSCs) were ranked by *P*-value and plotted in R (v3.5.2) for

visualization.

Chromatin peak heatmaps within cell adhesion pathways

To visualize how aging affects chromatin peak accessibility associated with cell adhesion, genes

associated with differential peaks that change with age in either freshly isolated qNSCs or aNSCs

respectively were intersected with the "Cell Adhesion" GO gene list (GO:0007155)

(http://www.informatics.jax.org). Differential peak accessibility levels were plotted as heatmaps

using "pheatmap" (v1.0.12) in R (v3.5.2) (TMM-normalized read counts, scaled row-wise).

Homer Motifs

To identify transcription factors that could be involved in aging, motif enrichment was

performed using the Homer tool "findMotifsGenome.pl" (v4.11.1)[98] with parameters "-size

given -mask" on differential peak lists (only Known Motifs are reported here) (see

Supplementary Tables 5). Since many enriched motifs were highly redundant, selected motifs

were grouped by identity and plotted for visualization (ranked by p-value) in R (v3.5.2).

De novo **transcription factor binding patterns using a deep learning model and TF-**

MoDISco

Binary open/closed chromatin was learned using a deep learning model (Basset architecture, i.e.

3 convolution layers, 2 fully connected layers followed by logit)[99] for each of the young and old

freshly isolated cell types (except for endothelial cells which were omitted due to inferior library

quality). For model training, naïve overlap peaks were used as positive examples (i.e. open

chromatin) and sequences from the rest of the genome were used as negative examples (i.e.

closed chromatin). The size of each example is a 1kb sequence, each taken with 50bp strides of

size 200 initially and expanded to 1kb later on. Sequences with at least 50% overlap with the

naïve peaks are positive examples and the rest are the negative examples. Each model was tested

on chromosome 1 and trained on rest of the chromosomes. Their genome-wide performance

ranged from 0.22 to 0.5 auPRC (Area Under precision recall curve) depending on the imbalance

ratio of positive and negative examples for the sequence. Notably, amongst all of the different

conditions, model performance for young and old qNSCs and aNSCs were among the best

compared to other cell types (above 0.45). We trained and tested our model performances for 10-

folds; since performance hardly varied across folds, we conducted rest of our analysis on the 1st

fold of models. Details of the performances across each sample and each folds, the correlation of

the model performances with the imbalance ratio can be found here -

http://mitra.stanford.edu/kundaje/msharmin/report/nsc_reports/NSC.html

To identify importance score on the sequences, for each sample we treated the peaks as 1kb

sequence centered around the peak summit and interpreted each base using DeepLIFT[35].

DeepLIFT assigns a score for each base of the sequence learned from the model based on how

important that base would be with respect to a set of background sequences. Next, we take the

importance score tracks and learned the over-represented important sequence patterns using

MoDISco[36,37]. MoDISco takes the importance scores, identifies the high scoring sub-sequences

(called seqlets) and cluster the seqlets into over-represented patterns called MoDISco-patterns.

Notably, given that deep learning models do not give 100% accuracy, we tried to pick the true-

positive peaks for finding MoDISco patterns. To clarify further, we interpreted only the peaks,

i.e. knowing that peaks are positive examples for the model. Hence, to pass the importance

scores to MoDISco, we filtered the peaks with high-scores as positive by the deep learning

model. The high-score is defined by the calibrated model-score

([https://github.com/kundajelab/abstention]) which gives 50% FDR cut off for the model

performance. Each MoDISco pattern for each sample is then matched with CISBP 2.00 motif

database and the matched motifs are listed into separate html files per sample (and per set of

differential regions) linked from here

(http://mitra.stanford.edu/kundaje/msharmin/report/nsc_reports/NSC.html).

For finding MoDISco pattern in the differential regions we took the previously selected regions

(as obtained using DiffBind[89,90]) and retained the regions with 50% overlap with one of the

defined 1kb peaks as described above. Then we filtered the differential peak sets based on true-

positive peak sets called by the model and used their importance scores on TF-MoDISco to find

the set of differential MoDISco patterns.

Single cell RNA-seq expression values for Cell Adhesion genes

Single cell gene expression data of the SVZ[25] consisting of 14,685 cells (8,884 cells from young

and 5,801 cells from old) were used in order to identify how gene expression differs by cell type

and age at single-cell resolution using an orthogonal dataset.

Single cell gene expression values for qNSCs/astrocytes, aNSCs/NPCs, and neuroblasts were

extracted and subset based on genes from the "Cell Adhesion" GO gene list (GO:0007155). For

each single cell within a cell population, the expression levels of cell adhesion genes were

summed. The cumulative expression level of adhesion genes comparing young

qNSCs/astrocytes, aNSCs/NPCs, and neuroblasts was visualized using violin plots with R

(v3.5.2). The cumulative expression level of adhesion genes comparing young and old

qNSCs/astrocytes, and young and old aNSCs/NPCs was visualized using violin plots with R

(v3.5.2). Statistical comparisons between conditions was performed in R using a two-tailed

Mann-Whitney test.

Using the same dataset, we investigated the relationship between cell cycle phase and cellular

adhesion. To this end, t-SNE analysis was performed on SVZ cells as previously described[25]

using the Seurat package (v3.1.5)[100]. The 8,884 single cells from the young SVZ were colored

based on expression of genes from the "Cell Adhesion" GO gene list (GO:0007155) as well as

by their cell cycle phase for side-by-side comparison.

We plotted the relationship between Seurat's "S phase score" and the cumulative expression of

genes from the "Cell Adhesion" GO gene list (GO:0007155) in qNSCs/astrocytes, aNSCs/NPCs,

and neuroblasts, and found no evidence of a correlative relationship between cellular adhesion

and proliferative propensity. For this analysis, each cell population was downsampled to the

number of old cells (480 qNSCs/astrocytes, 82 aNSCs/NPCs, and 146 neuroblasts).

Ingenuity Pathway Analysis (IPA)

Genes associated with differentially accessible peaks (FDR<0.05) that open in old aNSCs freshly

isolated from the SVZ were uploaded to Ingenuity Pathway Analysis (IPA) (v1.16)[101] (QIAGEN

Inc., https://www.qiagenbioinformatics.com/products/ingenuitypathway-analysis) to identify

age-related regulatory changes (see Supplementary Table 8). For each peak-associated gene, we

uploaded the log fold-change, p-value, and FDR (q-value) and based the IPA analysis on FDR.

Statistical enrichment of pathways was reported with *P*-values calculated by IPA using Fisher's

Exact Test.

Migration assay of cultured qNSCs and aNSCs/NPCs using live cell imaging

aNSCs/NPCs were cultured in complete activated media until Passage 2-4 and then seeded at a

density of 200,000 cells per well in a PDL-coated 12-well plate with complete activated media

treated with vehicle (H_2O) or 10μM Y-27632 (dissolved in H_2O) (Tocris, 1254). After 48 hours,

adherent aNSCs/NPCs were passaged with 500 μL of Accutase (STEMCELL Technologies,

07920), and resuspended in in Neurobasal-A (Gibco, 10888-022) supplemented with 2% B27

minus vitamin A (Gibco, 12587-010) and 1% penicillin–streptomycin–glutamine (Gibco, 10378-

016) with propidium iodide (BioLegend, 421301, 1:5000) for live/dead staining. 1000 live (PI-)

cells per well were sorted with flow cytometry using the BD PICI onto PDL-coated Incucyte

ImageLock 96-well plates (Essen BioScience, 4379) containing 100 μL of complete activated

media with 10 nM Syto64 (Invitrogen, S11346, Lot #8344573) and either vehicle (H_2O) or

10μM Y-27632 (dissolved in H_2O) (Tocris, 1254). The ImageLock plate was immediately

brought to the Incucyte Zoom or Incucyte S3 live imaging system to image (with Phase and RFP

channels) at 37°C every 30 min for 20 hours with the 20X objective. After 20 hours, the cell

media was washed 2x with PBS and then replaced with 100 μL of complete quiescent media.

Media was changed every other day for 7 days to induce quiescence. The media was then

replaced with complete quiescent media supplemented with 10 nM Syto64 (Invitrogen, S11346,

Lot #8344573) prior to imaging. Wells were imaged (with Phase and RFP channels) using either

the Incucyte S3 or Incucyte Zoom system with the 20X objective every hour for 20 hours at

37°C. Three images (from different parts of the well) at each timepoint were taken for each well

and tracked cell metrics were summed across these three images. Cell migration tracking was

performed using Imaris (v9.3.0). Every image stack was manually curated to ensure that cell

tracking was correctly performed (e.g. that automated cell tracking was not incorrectly labelling

debris and that cell tracks accurately follow individual cells). "Track Velocity" was output for

visualization with Prism (v8) and *P*-values were calculated with a two-tailed Mann-Whitney test

comparing both single cell values as well as sample mean values (where single cell velocities are

averaged by animal).

Matrigel migration assay

Activated NSCs/NPCs were cultured in complete activated media until Passage 4-6, passaged

with Accutase (STEMCELL Technologies, 07920), and resuspended in complete activated

media at a concentration of 100,000 cells/μL. Matrigel (Corning, 354230, Lot #8344573) was

diluted 1:2 in cold F12:DMEM (Gibco, 11-330-057) while on ice to prevent solidification, and

50 μL was immediately added per well to a 96-well plate. The 96-well plate was moved to the

37°C incubator for 3 hours prior to spotting 50,000 cells (in a volume of 0.5 μL) directly to the

center of the Matrigel-coated well. The plate was returned to the 37°C incubator for 15-30 min to

allow for cells to adhere. 150 μL of complete activated media (treated with vehicle (H_2O) or

10μM Y-27632 (dissolved in H_2O) (Tocris, 1254)) was very carefully added to each well, and

the 96-well plate was placed in either the Incucyte Zoom or Incucyte S3 live imaging system to

image every 6 hours for 48 hours using the 4x objective to image the entire well. For each

biological replicate, 1-4 technical replicates were quantified to account for difficulties in spotting

0.5 μL volumes, and the distances migrated at each timepoint were averaged among technical

replicates. We manually quantified invasion distance, defined as the maximum distance from the

initial spotting perimeter to the outermost cell body, using Fiji (v2)[102]. Neither imaging nor

analysis was performed in a blinded manner. *P*-values were calculated with a two-tailed Mann-

Whitney test at each 12-hour timepoint.

Immunofluorescence staining of SVZ coronal sections

Four young (4 months old) and four old (18-26 months old) GFAP-GFP animals of both sexes (2

male and 2 female animals per age condition) were subjected to intracardiac perfusion with 4%

paraformaldehyde (Electron Microscopy Sciences, 15714) in PBS. Brains were post-fixed

overnight in 4% paraformaldehyde (Electron Microscopy Sciences, 15714) and then dehydrated

in 30% sucrose (Sigma-Aldrich, S3929) for 72 hours. Brains were embedded in Tissue-Tek

optimal cutting temperature (O.C.T.) compound (Electron Microscopy Sciences, 62550),

sectioned in 16 μm coronal slices using a cryostat (Leica CM3050S), and then mounted on glass

slides (Fisher Scientific, 12-550-15). To ensure a similar anatomic region of the lateral ventricle

was being analyzed in each animal, the corpus callosum was first identified in the sections. This

section was selected to be stained for cell markers. Two additional sections, approximately 100

μm and 200 μm anterior to the corpus callosum were also selected to be stained for cell markers

for a total of 3 sections per animal. To perform immunofluorescent staining, sections were

washed with PBS and then permeabilized with ice-cold methanol + 0.1% Triton X-100 (Fisher

Scientific, BP151) for 15 min. Slides were washed 3x with PBS for 5 min. Antigen retrieval was

performed in 10mM sodium citrate buffer (pH 6.0) (2.94 g Tri-sodium citrate dihydrate (Sigma-

Aldrich, S1804) in 1000 mL milliQ H_2O adjusted to pH 6.0 with 1N HCl) + 0.05% TWEEN 20

(Sigma-Aldrich, P1379-1L) at 85°C for 2 hours. Slides were then cooled to room temperature for

20 min, and sections were blocked with 5% Normal Donkey Serum (NDS) (ImmunoReagents

Inc., SP-072-VX10) and 1% BSA (Sigma, A7979) in PBS for 30 min at room temperature.

Primary antibody staining was performed overnight at 4°C in 5% Normal Donkey Serum and 1%

BSA in PBS. Primary antibodies used were the following: Ki67 (Invitrogen, SolA15 [1:200])

and GFAP (Abcam, ab53554, [1:500]). Sections were then washed 3x with PBS and 0.2%

TWEEN 20 for 10 min at room temperature followed by two PBS washes for 15 min. Secondary

antibody staining was performed at room temperature for 2 hours in 5% NDS and 1% BSA in

PBS. Secondary antibodies used were the following: Donkey anti-Goat 488 (Sigma Aldrich,

SAB460032-250UL [1:1000]), and Donkey anti-Rat 594 (Life Technologies, A21209 [1:1000]).

DAPI (ThermoFisher, 62248 [1:500]) was added during secondary antibody staining. Sections

were washed 3x for with PBS and 0.2% TWEEN 20 for 10 min at room temperature followed by

3 PBS washes for 5 min. Sections were mounted with ProLong Gold Antifade Mountant with

DAPI (ThermoFisher, P36931) and visualized with a Nikon Eclipse Ti confocal microscope

equipped with a Zyla sCMOS camera (Andor) and NIS- Elements software (AR 4.30.02, 64-bit).

Multiple Z-stacks using the 60x objective were captured to image the entire length of the SVZ

from one hemisphere per section. These Z-stacks (30 slices per stack) were transformed into a Z-

projection (max intensity) and quantified using a custom pipeline. GFAP-positive and Ki67-

positive nuclei were identified as aNSCs. GFAP-positive and Ki67-negative nuclei were

identified as qNSCs/astrocytes. Although rare, NSCs lining blood vessels were censored in the

analysis. The center of each NSC nuclei was chosen as a reliable and consistent fixed point to

assess cell localization. Distances from the ventricle were calculated by measuring Euclidean

distance from the center of the nucleus of each cell of interest to the ventricle border in Fiji (v2).

Neither imaging nor analysis was performed in a blinded manner. *P*-values were calculated with

a two-tailed Mann-Whitney test. For immunofluorescent images in this manuscript, brightness

and contrast were adjusted in Fiji (v2) to enhance visualization. These adjustments were

performed after all data quantification was complete. The same settings were applied to all

images shown for each experiment.

***In vivo* SVZ migration by EdU-labelling**

Young (2-3 months) and old (21 months) male C57BL/6 animals were intraperitoneally injected

with 5-ethynyl-2'-deoxyuridine (EdU) (Fisher Scientific, A10044) (resuspended in PBS at 5

mg/mL) at a dose of 50 mg/kg either 4 hours, 2 days, or 7 days prior to intracardiac perfusion

with 4% paraformaldehyde (PFA) (Electron Microscopy Sciences, 15714) in PBS. Brains were

post-fixed overnight in 4% PFA and then dehydrated in 30% sucrose (Sigma-Aldrich, S3929) for

72 hours. Brains were embedded in Tissue-Tek optimal cutting temperature (O.C.T.) compound

(Electron Microscopy Sciences, 62550) and sectioned in 16 μm sagittal slices using a cryostat

(Leica CM3050S) that were then mounted on glass slides (Fisher Scientific, 12-550-15).

Immunofluorescent staining of sagittal sections was performed as above (see

Immunofluorescence staining of SVZ coronal sections) except that the CliCK-IT EdU Alexa

Fluor 488 imaging protocol (Thermo Fisher Scientific, C10337) was performed for 30 min at

room temperature prior to blocking. The following primary antibodies were used: Ki67

(Invitrogen, SolA15 [1:200]) and DCX (Cell Signaling Technologies, 4604 [1:500]). The

following secondary antibodies were used: Donkey anti-Rabbit Alexa 568 (Invitrogen, A10042

[1:500]) and Goat anti-Rat Alexa 647 (Invitrogen, A21247 [1:500]). DAPI (1 mg/mL)

(ThermoFisher, 62248) was included at a concentration of 1:500 with the secondary antibody

mix. Sections were mounted with ProLong Gold Antifade Mountant with DAPI (ThermoFisher,

P36931) and visualized with a Zeiss LSM 900 confocal microscope equipped with Zeiss ZEN

Blue 3.0 software.

Multiple sections per brain were stained and imaged to determine the optimal depth to capture

SVZ/RMS migration and the most appropriate section per animal was imaged and quantified.

Appropriate sections were selected based on presence of an intact RMS as judged by a stream of

DCX-positive cells connecting the SVZ to the OB. Images of sagittal sections were captured

using a 5x objective and 9x3 images (for a total of 27) were automatically stitched together using

the Zeiss ZEN Blue 3.0 software. For quantification, EdU-labelled nuclei were counted using Fiji

(v2)[102]. Briefly, every image was converted to 8-bit, the threshold was adjusted ((90,255) for

replicate 1 and (70,255) for replicate 2), watershed was applied to the image and EdU-labelled

nuclei were counted with "Analyze Particles (size (micron^2): (20-infinity) for replicate 1 and 2,

and circularity: (0.2-1.00) for replicate 1)". EdU-labelled nuclei were quantified in three regions

(SVZ, RMS, and OB) which were manually defined using a hand-drawn region of interest (ROI)

for each slide. To calculate distances of EdU+ cells from the ventricle, images of the SVZ from

the sagittal sections used above were captured using a 20x objective and subject to the same

analysis as described in (*Immunofluorescence staining of SVZ coronal sections*). EdU+ cells

were classified as aNSCs/NPCs if they were Ki67-positive and DCX-negative and as neuroblasts

if they were DCX-positive. One old 7-day post-injection replicate from the first experiment was

censored due to a failed intraperitoneal EdU injection and one young 7-day post-injection

replicate from the second experiment was censored due to lack of high quality sections at the

appropriate depth. Neither imaging nor analysis was performed in a blinded manner. *P*-values

were calculated with a two-tailed Mann-Whitney test.

Immunofluorescence staining of young and old cultured NSCs

NSCs were cultured as described above (see *Primary NSC culture*) in complete activated media

until Passage 2-3 and then seeded at a density of 200,000 cells per well in a PDL-coated 12-well

plate with complete activated media. After 48 hours, adherent aNSCs/NPCs were passaged with

500 μL of Accutase (STEMCELL Technologies, 07920), and resuspended in Neurobasal-A

(Gibco, 10888-022) supplemented with 2% B27 minus vitamin A (Gibco, 12587-010) and 1%

penicillin–streptomycin–glutamine (Gibco, 10378-016) with propidium iodide (BioLegend,

421301, 1:5000) for live/dead staining. 1000 live (PI-) cells per well were FACS sorted using the

BD PICI onto PDL-coated glass-bottomed 96-well plates (Cellvis, P96-1.5H-N) containing 100

μL of either complete activated media or complete quiescent media. After 24 hours for the

activated plates and 5-7 days for the quiescent plates, the sorted wells were washed 1x with PBS,

then fixed with 4% paraformaldehyde (Electron Microscopy Sciences, 15714) for 15 min. Wells

were washed 4x with PBS and then stored, wrapped in parafilm, at 4°C until

immunofluorescence staining. Cells were washed 2x with PBS and permeabilized with 0.1%

Triton X-100 (Fisher Scientific, BP151). Blocking was performed for 30 min with 1% BSA

(Sigma, A7979) in PBS. Primary staining was conducted for 1 hour at room temperature with

phalloidin (Invitrogen, A12379, 665217, 1:500) resuspended in 1% BSA (Sigma, A7979). Wells

were then washed 4x with PBS and secondary staining was performed for 1 hour at room

temperature with Donkey anti-Rabbit Alexa 568 (Invitrogen, A10042, 1:500) resuspended in 1%

BSA (Sigma, A7979). Wells were washed 4x with PBS+0.2% TWEEN 20 (Sigma-Aldrich,

P1379-1L), then 4x with PBS prior to imaging. Imaging was performed on a Nikon Eclipse Ti

confocal microscope equipped with a Zyla sCMOS camera (Andor) and NIS- Elements software

(AR 4.30.02, 64-bit) using the 60x objective. Quantification of immunofluorescence staining of

F-actin was done using a custom pipeline in Fiji (v2)[102]. Fluorescence intensity in regions of

high-density phalloidin staining were quantified as a proxy for bundled actin. Briefly, images

were converted to 8-bit, inverted and an intensity threshold was manually set in the phalloidin

channel to generate a mask. The same threshold values were used for all images across all

conditions in each individual experiment. The sum of pixel intensity within the cell mask

(RawIntDen) was then used to determine fluorescence intensity for each cell. For each

experiment, values were normalized by dividing each cell's fluorescence intensity by the mean

fluorescence intensity of all cells in the young condition. Neither imaging nor analysis was

performed in a blinded manner. *P*-values were calculated with a two-tailed Mann-Whitney test.

RGD molecular tension sensor FRET measurements of cultured NSCs

Sensors containing a minimal RGD sequence derived from fibronectin

(TVYAVTGRGDSPASSAA) were expressed, purified, and labeled with AlexaFluor-546 and -

647, and coverslips passivated with maleimide polyethylene glycol (PEG) succinimidyl

carboxymethyl ester (JenKem Technology, A5003-1) were prepared as previously

described[55,103]. Flow chambers for imaging were prepared as described[103] with slight

modifications. 8-well flow chambers (Grace BioLabs, #622505, ~55µL channel volume) were

attached to PEGylated coverslips as previously described[104]. Chambers were incubated with 300

nM double-labeled sensor at room temperature for 45 min. The chambers were then washed with

150 µL of PBS for 1 min to prevent non-specific cell attachment. 60 µL of cell suspensions at a

density of 300,000-400,000 cells/mL were added to the channels, and the chambers were

incubated for 3 hours at 37°C and 5% CO2 in complete activation media to allow cells to spread.

Chambers were then washed with 150 µL of warm media, and brightfield and FRET

measurements were made immediately after and acquired with an objective heater (Bioptechs)

set to 37°C. For measurements on cells treated with Y-27632, complete activation media was

supplemented with 10µM Y-27632 (dissolved in H_2O) (Tocris, 1254)) for cell suspensions and

media washes.

We limited our measurements and analysis to individual cells that looked well-spread in

brightfield and cell clusters of no more than 5 cells in which cell outlines could be clearly

distinguished. FRET fluorescence measurements were performed with objective-type total

internal reflection fluorescence (TIRF) microscopy on an inverted microscope (Nikon TiE) with

an Apo TIRF 100× oil objective lens, numerical aperture 1.49 (Nikon) as described previously[55]

and controlled using Micromanager[105]. Samples were excited with 532-nm (Crystalaser) or 635-

nm (Blue Sky Research) lasers. Emitted light passed through a quad-edge laser-flat dichroic with

center/bandwidths of 405/60 nm, 488/100 nm, 532/100 nm, and 635/100 nm from Semrock Inc.

(Di01-R405/488/532/635-25×36) and corresponding quad-pass filter with center/bandwidths of

446/37 nm, 510/20 nm, 581/70 nm, 703/88 nm band-pass filter (FF01-446/510/581/703-25).

Donor and acceptor images were taken through separate additional cubes stacked into the light

path (donor: 550 nm long-pass; acceptor: 679/41 nm and 700/75 nm) and recorded on a

Hamamatsu Orca Flash 4.0 camera.

Images were prepared in Fiji (v2)[102] and analyzed using custom MATLAB scripts, in which

FRET efficiencies were computed and thresholded to identify adhesions and quantify forces

within adhesions. An appreciable fraction of cultured aNSCs/NPCs seeded on RGD molecular

tension sensors did not exhibit distinct focal adhesion patterns upon analysis, potentially

reflecting cells generating tractions below the sensitivity threshold of the assay. To compare the

adhesive forces of these cells with those that had distinct focal adhesions, we used the average

FRET/force values underneath the entire cell body as a metric for the adhesive strength in cells

without adhesions. While we observed significant differences in fractions of old and young

aNSCs exhibiting force-generating adhesions through this analysis, we observed that these

differences may be driven by divergent phenotypes in integrin-mediated force upon contact with

other cells. For the cells that were imaged and analyzed, we observed little difference in focal

adhesion phenotype in isolated cells but sharp differences in phenotype in cells that were in

small clusters. These data are aggregated in Fig. 4e,f, Fig. 5d,e, and Extended Fig. 8.

Immunofluorescence staining of cultured NSCs treated with ROCK inhibition

aNSCs/NPCs were cultured as described above (see *Primary NSC culture*) in complete activated

media until Passage 2-3 and then seeded at a density of 200,000 cells per well in a PDL-coated

12-well plate with complete activated media treated with vehicle (H$_2$O) or 10μM Y-27632

(dissolved in H$_2$O) (Tocris, 1254). After 48 hours, adherent aNSCs/NPCs were passaged with

500 μL of Accutase (STEMCELL Technologies, 07920), and resuspended in Neurobasal-A

(Gibco, 10888-022) supplemented with 2% B27 minus vitamin A (Gibco, 12587-010) and 1%

penicillin–streptomycin–glutamine (Gibco, 10378-016) with propidium iodide (BioLegend,

421301, 1:5000) for live/dead staining. 1000 live (PI-) cells per well were FACS sorted using the

BD PICI onto PDL-coated glass-bottomed 96-well plates (Cellvis, P96-1.5H-N) containing 100

μL of complete activated media treated with vehicle (H$_2$O) or 10μM Y-27632 (dissolved in H$_2$O)

(Tocris, 1254). After 24 hours, the sorted wells were washed 1x with PBS, then fixed with 4%

paraformaldehyde (Electron Microscopy Sciences, 15714) for 15 min. Wells were washed 4x

with PBS and then stored, wrapped in parafilm, at 4°C until immunofluorescence staining.

Staining and quantification of old cultured aNSCs/NPCs for ROCK inhibition experiments was

otherwise performed in the same manner as described above (see *Immunofluorescence staining*

of young and old cultured NSCs).

Statistical analyses

For all experiments, young and old conditions were processed in an alternate manner rather than

in two large groups, to minimize the group effect. We did not perform power analyses, though

we did take into account previous experiments to determine the number of animals needed. To

calculate statistical significance for experiments, all tests were two-sided Mann-Whitney tests

(with the exception of Fisher's Exact Tests which are noted in Figure Legends). Results from

individual experiments and all statistical analyses are included in Supplementary Table 1.

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Figure 1

1228   **Figure 1: The chromatin landscape of five cell types in the SVZ neurogenic region reveals**

1229   **opposing chromatin changes with age in quiescent and activated NSCs involving cell**

1230   **adhesion and migration pathways**

1231

a) Experimental design for freshly isolating cells from the subventricular zone (SVZ)

neurogenic niche in young (3-5 months) and old (20-24 months) GFAP-GFP mice. For each

library, 800-2000 cells were pooled from male and female GFAP-GFP mice using

fluorescence-activated cell sorted (FACS) (see Methods). NSC: neural stem cell. GFAP,

Glial Fibrillary Acidic Protein. PROM1, Prominin-1. EGFR, epidermal growth factor

receptor.

b) Principal Component Analysis (PCA) on all chromatin peaks from endothelial cells,

astrocytes, quiescent NSCs (qNSCs), activated NSCs (aNSCs), and neural progenitor cells

(NPCs) freshly isolated from the SVZ of young (triangle) and old (round) GFAP-GFP mice

where each dot represents a single ATAC-seq library. PCA was generated using the variance

stabilizing transformation (VST)-normalized global consensus count matrix. PC, principal

component.

c) Genome browser (IGV) view of chromatin accessibility signal tracks from representative

RPKM-normalized libraries of all SVZ niche cell types around the *Ascl1* loci. Black arrows

represent sites of differentially accessible peaks that open in young aNSCs when compared to

young qNSCs. *Ascl1*, Achaete-Scute Family bHLH Transcription Factor 1. Scale bar, 1kb.

d) PCA on all genome-wide chromatin peaks (left) and mRNA gene expression[28] (right) from

qNSCs and aNSCs freshly isolated from the young and old SVZ where each dot represents a

single sequencing library (PC1 vs. PC3). ATAC-seq libraries are represented by diamonds

and RNA-seq libraries are represented by squares. PCAs were both generated using variance

stabilizing transformation (VST)-normalized read counts. PC, principal component.

e) Bar graph representing the genomic distribution of open chromatin peaks for qNSCs and

aNSCs in young and old conditions based on their pooled peaksets. ATAC-seq peaks were

annotated with ChIPSeeker (v1.18.0). Grey box indicates distal and intronic peaks that likely

contain putative enhancers.

f) PCA on putative enhancers (exclusively distal/intronic chromatin peaks) from qNSCs and

aNSCs freshly isolated from the young and old SVZ where each dot represents a single

ATAC-seq library (PC1 vs. PC3). PCA was generated using the variance stabilizing

transformation (VST)-normalized NSC consensus count matrix. PC, principal component.

g) Chromosome-level visualization of differentially accessible ATAC-seq peaks (FDR<0.05)

that change with age in qNSCs (left) and aNSCs (right) respectively. Each vertical bar

represents a dynamic ATAC-seq peak aligned to mouse chromosomes (*mm10* version of the

mouse genome) that is differentially open in young (top) or old (bottom) NSCs.

h,i) Selected GO terms for genes associated with differentially accessible ATAC-seq peaks

(FDR<0.05) that change with age in quiescent (h) and activated (i) NSCs generated by

EnrichR and ranked by *P*-value. ATAC-seq peaks were annotated with their nearest gene

using ChIPSeeker (v1.18.0). Red boxes indicate GO terms associated with adhesion and

migration.

1270

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Figure 2

a

Differential chromatin peaks *in vivo* - Cell Adhesion

Quiescent NSC

Adamts9
Adam17
Anxa1,9
Cdh2,5,6,7,9
Cdh13,18,20
Cdh22,23,26
Cdhr1,2,3
Efna5, Efnb2
Itgb6, Itgb8
Itga3, Itgae
Ncam2
Tnr, Tnc

More accessible 2 / 0 / -2 Less accessible

Young   Old

Activated NSC

Acan
Adamts18
Cdh13,16,20
Cdh22,26
Cntnap5a,b
Efnb2
Itgb1,6
Ncam2
Pcdh18
Tnr, Tnc

Young   Old

b

Young qNSC
Old qNSC
Young aNSC
Old aNSC

Cdhr3   *Pcdh18*

c

Quiescent NSC

TF-MoDISco Pattern	TF names
Open in young	CTCF, CTCFL
	SP, KLF, E2F family, ...
	NFIB, NFIC
Open in old	CTCF, CTCFL

Activated NSC

TF-MoDISco Pattern	TF names
Open in young	SP, KLF, E2F family, ...
	n/a
	CTCF
Open in old	NFIB, NFIC
	CTCF, CTCFL
	SP, KLF, E2F family, ...

d

In vivo scRNA-seq - Cell Adhesion

P = 6.9e-15   P = 0.0016

Single cell gene expression

Young   Old   Young   Old
qNSC/Astrocyte   aNSC/NPC

e

Young / Old → SVZ → qNSC / aNSC/NPC → ATAC-seq / Confocal microscopy / Migration tracking

f

Cultured qNSC   Cultured aNSC/NPC

50 μm   50 μm   DAPI Phalloidin

g

Cultured qNSC

Open in young ← → Open in old

Neuron development
Regulation of cytoskeleton organization
Homophilic cell adhesion (plasma membrane)
Second-messenger-mediated signaling
Negative chemotaxis
Heterophilic cell-cell adhesion (plasma membrane)
Axon guidance
Axonogenesis

-log₁₀(p-value)

h

Cultured aNSC/NPC

Open in young ← → Open in old

Detection of calcium ions
Cellular response to purine-containing compound
Cell communication by electrical coupling
Axonogenesis
Positive regulation of cell-substrate adhesion
Heterophilic cell-cell adhesion (plasma membrane)
Substrate adhesion-dependent cell spreading
Neuron projection extension

-log₁₀(p-value)

i

Cultured aNSC/NPC migration tracking

t = 0 hours   t = 10 hours
t = 15 hours   t = 20 hours

50 μm

j

Cultured qNSC

P = 0.0096

Velocity (μm/hr)

Young   Old

k

Cultured aNSC/NPC

P = 0.0002

Velocity (μm/hr)

Young   Old

l

Cultured aNSC/NPC (Matrigel)

t = 0 hours   t = 24 hours   t = 48 hours

Young

Old

m

Cultured aNSC/NPC (Matrigel)

Distance migrated (μm)

P = 0.0012
P = 0.0097
P = 0.0068
P = 0.0002

Young
Old

Time (hours)

1273 **Figure 2: The opposing chromatin changes in old quiescent and activated NSCs with aging**

1274 **are associated with functional defects in cell adhesion and migration**

1275

a) Heatmap showing accessibility levels of differential ATAC-seq peaks associated with the

"Cell Adhesion" GO category (GO:0007155) that change with age in qNSCs (left) and

aNSCs (right) respectively. Selected gene names with associated differentially accessible

peaks are displayed. TMM-normalized read counts (by EdgeR), scaled row-wise.

b) Genome browser (IGV) view of chromatin accessibility signal tracks from representative

RPKM-normalized libraries of quiescent and activated NSCs isolated from young and old

brains illustrating differential chromatin peaks that change with age in young quiescent NSCs

(left) and old activated NSCs (right) respectively. Black arrows represent sites of

differentially accessible peaks that change with age in qNSCs (left) and aNSCs (right)

respectively. *Cdhr3*, Cadherin Related Family Member 3. *Pcdh18*, Protocadherin 18. Scale

bar, 5kb.

c) Enrichment of top-ranked transcription factor motifs by TF-MoDISco within differentially

accessible ATAC-seq peaks that change with age in qNSCs (left) and aNSCs (right). Red box

indicates motif associated with NFI family.

d) Violin plots of the average distribution of single cell cumulative expression profiles of genes

within the "Cell Adhesion" GO category (GO:0007155) for young and old qNSCs/astrocytes

(left) and aNSCs/NPCs (right) from scRNA-seq data[25]. Each overlaid dot represents the

cumulative expression of cell adhesion genes in a single cell. *P*-values were calculated using

a two-tailed Mann-Whitney test.

e) Schematic illustrating the general protocol for experiments involving cultured qNSCs and

aNSCs/NPCs. Young (3-5 months) and old (20-24 months) C57BL/6 SVZs were

microdissected and tissues were processed to enable NSC culture. Quiescence was induced

with growth factors bFGF and BMP4 for 5-10 days, and activation was maintained with

bFGF and EGF for 1-2 days prior to downstream experiments (ATAC-seq library generation,

confocal microscopy, and live-cell migration tracking).

f) Representative images of immunofluorescence staining of a young (3 months) qNSC (left)

and aNSC/NPC (right) cultured on Poly-D-Lysine. Blue, DAPI (nuclei); green, phalloidin (F-

actin). Scale bar, 50 μm.

g,h) Selected GO terms for genes associated with differentially accessible ATAC-seq peaks

(FDR<0.05) that change with age in cultured qNSCs (g) and aNSCs/NPCs (h) generated by

EnrichR and ranked by *P*-value. Red boxes indicate GO terms associated with cell adhesion

and cell migration.

i) Representative images of a young (3-4 months) aNSC/NPC in the presence of cell-permeant

red fluorescent nucleic acid stain Syto64 taken at t = 0, 10, 15, and 20 hours after sorting

onto Poly-D-Lysine. The Incucyte system was used for 20x imaging and migration tracks

were determined using Imaris (v9.3.0). Color gradient bar represents the passage of time

from 0 (blue) to 20 (red) hours. Scale bar, 50 μm.

j) Migration speed of young (3-4 months) and old (23-24 months) qNSCs on Poly-D-Lysine.

Each dot represents the average velocity of a single cell over a 20-hour period (*n* = 6 young

male mice, and *n* = 4 old male mice) (combined over 2 experiments). Data are mean ± SEM.

P-values were calculated using a two-tailed Mann-Whitney test.

k) Migration speed of young (3-4 months) and old (21-24 months) aNSCs/NPCs on Poly-D-

Lysine. Each dot represents the average velocity of a single cell over a 20-hour period ($n = 9$

young male mice, and $n = 7$ old male mice) (combined over 3 experiments). Data are mean ±

SEM. *P*-values were calculated using a two-tailed Mann-Whitney test.

l) Representative images of young (top) and old (bottom) aNSC/NPC invasion through

Matrigel taken 0, 24, and 48 hours after seeding aNSCs/NPCs. The dotted white outline

represents the outermost extent of invasion and the inner dotted white line represents the

initial extent of the cells after seeding (t = 0 hours). Scale bar, 800 μm.

m) Migration distance timecourse of young (3-4 months) and old (21-24 months) aNSC/NPC

invasion through Matrigel over 48 hours with 12-hour intervals. ($n = 7$ young male mice, and

$n = 10$ old male mice) (combined over 2 experiments). For each biological replicate, 1-4

technical replicates were evaluated, and migration distance was averaged at each timepoint.

Data are mean ± SEM. *P*-values were calculated at each timepoint using a two-tailed Mann-

Whitney test.

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Figure 3

1339 **Figure 3: Age-dependent cell adhesion and migration defects of quiescent and activated**

1340 **NSCs and progenitors *in vivo***

1341

a) Design of immunofluorescence experiments for quantifying the localization of

qNSCs/astrocytes and aNSCs *in vivo* during aging in coronal brain sections. Young (4

months) and old (18-26 months) mixed-sex GFAP-GFP animals were perfused with 4%

PFA, brains were cryosectioned at a thickness of 16 μm and stained for cell markers prior to

quantification with confocal microscopy.

b) Representative images of immunofluorescence staining of coronal SVZ sections from young

(4 months) (left) and old (18-26 months) (right) GFAP-GFP brains. Yellow box denotes inset

containing qNSCs/astrocytes (GFAP+/Ki67-) and aNSCs (GFAP+/Ki67+) indicated with

white arrows and arrowheads, respectively. The ventricular lining is indicated by a dotted

white line. Blue, DAPI (nuclei); green, GFAP (Astrocyte/NSC marker); pink, Ki67

(proliferation marker). Scale bar, 50 μm.

c) NSC distance to the ventricle was calculated for qNSCs/astrocytes (GFAP+/Ki67-) and

aNSCs (GFAP+/Ki67+) in coronal sections of young (4 months) and old (18-26 months)

SVZs. Each gray dot represents the distance of a single cell from the ventricular lining and

each colored dot represents the mean distance from the ventricle per animal ($n = 4$ mixed-sex

young mice, and $n = 4$ mixed-sex old mice) (combined over 4 paired young/old experiments).

Data are mean ± SEM. Ast, astrocytes. *P*-values were calculated using a two-tailed Mann-

Whitney test comparing sample means between conditions.

d) Design of immunofluorescence experiments to assess EdU-labelled NSC migration out of the

SVZ *in vivo*. Young (2-3 months) and old (21 months) C57/BL6 male animals were

intraperitoneally injected with EdU, and then sacrificed and perfused with 4% PFA after a

time interval of 4 hours, 2 days, or 7 days. Perfused brains were sagittally cryosectioned at a

thickness of 16 μm and stained for EdU and cell markers prior to quantification with

confocal microscopy. EdU, 5-Ethynyl-2'-deoxyuridine. I.p., intraperitoneal.

e) Representative immunofluorescence staining of sagittal sections encompassing the

subventricular zone (SVZ) niche, rostral migratory stream (RMS), and olfactory bulb (OB) of

a young (2-3 months) male C57BL/6 mouse 4hrs after intraperitoneal EdU injection. Blue,

DAPI (nuclei); green, EdU (proliferation marker); pink, Ki67 (aNSC/NPC/neuroblast

marker); red, DCX (neuroblast marker). Scale bar, 500 μm.

f) Representative image of immunofluorescence staining in sagittal sections of the SVZ niche

from a young (2-3 months) (top) or old (21 months) (bottom) male C57BL/6 mouse 4hrs

(left) or 7 days (right) after intraperitoneal EdU injection. The ventricular lining is indicated

by a dotted white line. Green, EdU (proliferation marker); pink, Ki67 (aNSC/NPC/neuroblast

marker); red, DCX (neuroblast marker). Scale bar, 100 μm.

1376**g,h,i)** Quantification of EdU+ cells counted in the SVZ (g), RMS (h), and OB (i) from young (2-3

1377   months) sagittal sections 4 hours, 2 days, and 7 days post-injection of EdU. Each colored dot

1378   represents the number of EdU+ cells counted in a sagittal section from a single animal ($n = 5$

1379   young male mice 4 hours post-injection, $n = 3$ young male mice 2 days post-injection, $n = 4$

1380   young male mice 7 days post-injection) (combined over 2 experiment). Data are mean ±

1381   SEM. *P*-values were calculated using a two-tailed Mann-Whitney test.

1382**j,k,l)** Quantification of EdU+ cells counted in the SVZ (j), RMS (k), and OB (l) from old (21

months) sagittal sections 4 hours, 2 days, and 7 days post-injection of EdU. Each colored dot

represents the number of EdU+ cells counted in a sagittal section from a single animal ($n = 5$

old male mice 4 hours post-injection, $n = 3$ old male mice 2 days post-injection, $n = 4$ old

male mice 7 days post-injection) (combined over 2 experiment). Data are mean ± SEM. *P*-

values were calculated using a two-tailed Mann-Whitney test.

m) Representative images of immunofluorescence staining of sagittal SVZ sections of young (2-

3 months) (left) and old (21 months) (right) male C57BL/6 mice 4hrs after intraperitoneal

EdU injection. Blue, DAPI (nuclei); green, EdU (proliferation marker); pink, Ki67

(aNSC/NPC/neuroblast marker); red, DCX (neuroblast marker). Dotted white line indicates

ventricle wall and white arrows indicate selected EdU-positive cells. Scale bar, 50 μm.

n) Distance to the ventricle was calculated for EdU+ aNSCs/NPCs (Ki67+/DCX-) in sagittal

sections of young (2-3 months) and old (21 months) SVZs 4 hours after EdU injection. Each

gray dot represents the distance of a single aNSC/NPC from the ventricle and each colored

dot represents the mean aNSC/NPC distance from the ventricle per animal ($n = 5$ young male

mice, and $n = 5$ old male mice) (combined over 2 experiments). Data are mean ± SEM. *P*-

values were calculated using a two-tailed Mann-Whitney test comparing sample means

between conditions.

o) Distance to the ventricle was calculated for EdU+ neuroblasts (DCX+) in sagittal sections of

young (2-3 months) and old (21 months) SVZs 4 hours after EdU injection. Each gray dot

represents the distance of a single neuroblast from the ventricle and each colored dot

represents the mean neuroblast distance from the ventricle per animal ($n = 5$ young male

mice, and $n = 5$ old male mice) (combined over 2 experiments). Data are mean ± SEM. *P*-

values were calculated using a two-tailed Mann-Whitney test comparing sample means

between conditions.

Figure 4

a

b aNSC/NPC

Young

50 μm

Old

50 μm

DAPI
Phalloidin
Bundled actin

c aNSC/NPC

P = 0.0625

d Young aNSC/NPC

Phase

10 μm

FRET

10 μm

Low Force

High Force

e aNSC/NPC

P = 0.0554

f aNSC/NPC

+47.96%
P = 0.0327

(n = 85) (n = 90)

1407 **Figure 4: Aging increases the occurrence of force-producing focal adhesions in**

1408 **aNSCs/NPCs**

1409

a) Diagram of RGD molecular tension sensor (adapted from previous work[55]). As cells adhere

to the tension sensor-coated substrate, integrin heterodimers bind to the RGD cell-binding

domain and exert force across a molecular spring, resulting in decreased FRET signal. RGD,

peptide containing tripeptide Arg-Gly-Asp motif. FRET, Förster resonance energy transfer.

b) Representative images of immunofluorescence staining of young (3-4 months) (top) and old

(21-24 months) (bottom) cultured aNSCs/NPCs on Poly-D-Lysine. Blue, DAPI (nuclei);

green, phalloidin (F-actin); white, high-intensity phalloidin mask (bundled actin). Scale bar,

50 μm.

c) Bundled actin fluorescence intensity in young (3-4 months) and old (21-24 months) cultured

aNSCs/NPCs, normalized to the mean levels of the young condition. Each gray dot

represents bundled actin levels in a single cell and each colored dot represents the average

cellular bundled actin level per animal ($n = 9$ young male mice, and $n = 9$ old male mice)

(combined over 3 experiments). Data are mean ± SEM. *P*-values were calculated using a

two-tailed Mann-Whitney test comparing sample means between conditions.

d) Representative image of a young (3 months) cultured aNSC/NPC seeded on RGD molecular

tension sensors taken with phase contrast (top) and FRET donor/acceptor fluorescence

wavelengths to generate a high-resolution traction map of FRET efficiency (bottom). The

colored bar reflects the FRET efficiency, a measure of adhesion strength, where a low FRET

efficiency indicates high force (blue color) and a high FRET efficiency indicates low force

(yellow/green color). Scale bar, 10 μm.

e) Average force per sensor (pN) in individual focal adhesions exhibited by young (3 months)

and old (21 months) cultured aNSCs/NPCs determined using RGD molecular tension sensors

(n = 85 young aNSCs/NPCs, and n = 90 old aNSCs/NPCs) (combined over 2 separate

experiments). Shading delineates the bimodal populations of cells with active focal adhesions

(light grey, each dot represents the average force sensor reading among focal adhesions for a

single cell) or no detected focal adhesion (dark grey, each dot represents the average force

sensor reading underneath the cell body). *P*-values were calculated using a two-tailed Mann-

Whitney test.

f) Fraction of young (3 months) and old (21 months) cultured aNSCs/NPCs exhibiting focal

adhesion patterns as determined from RGD tension sensor experiments (combined over 2

separate experiments). *P*-values were calculated using a combined Fisher's exact test.

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Figure 5

a Open in old

Gα 12/13 Signaling
Synaptogenesis Signaling
Axonal Guidance Signaling
GABA Receptor Signaling
Role of NFAT in Cardiac Hypertrophy
Heparan Sulfate Biosynthesis
Gαi Signaling
Heparan Sulfate Biosynthesis (Late)
Opioid Signaling
Gap Junction Signaling

-log₁₀(p-value)

b Gα 12/13

PI3K/AKT   RhoA   JNK
NF-κB   c-JUN
Cell proliferation   Cell proliferation
& Differentiation   & Differentiation

ROCK

Autophagy   Cell shape & Motility
Cell survival   Vesicle   Cytoskeleton   Cell growth
& Apoptosis   dynamics   regulation   & Regeneration

c Phase   FRET
No treatment   Old aNSC/NPC   10 μm   10 μm
+ Y-27632 (ROCK inhibitor)   Old aNSC/NPC   10 μm   10 μm
Low Force / High Force

d aNSC/NPC
Average force per sensor in focal adhesions (pN)
P < 0.0001   P < 0.0001
Young No treatment / Young + Y-27632 / Old No treatment / Old + Y-27632

e aNSC/NPC
Adhesion Area (μm²)
P < 0.0001   P < 0.0001
Young No treatment / Young + Y-27632 / Old No treatment / Old + Y-27632

f Old aNSC/NPC
No treatment   50 μm
+ Y-27632 (ROCK inhibitor)   50 μm
DAPI / Phalloidin / Bundled actin

g Old aNSC/NPC
Bundled actin staining (Normalized fluorescence intensity)
P = 0.0022
Old No treatment / Old + Y-27632

h Old aNSC/NPC
No treatment   Syto64   50 μm
+ Y-27632 (ROCK inhibitor)   50 μm

i aNSC/NPC
Velocity (μm/hr)
P < 0.0001   P < 0.0001
Young No treatment / Young + Y-27632 / Old No treatment / Old + Y-27632

j aNSC/NPC
Distance migrated after 48hrs (μm)
n.s.   P = 0.041
Young No treatment / Young + Y-27632 / Old No treatment / Old + Y-27632

1452 **Figure 5: Inhibition of ROCK boosts migration speed and eliminates focal adhesions in**

1453 **aNSCs/NPCs from aged brains**

1454

a) Top 10 canonical pathways enriched for genes associated with differentially accessible peaks

that open with age in freshly isolated aNSCs (FDR<0.05) generated by Ingenuity Pathway

Analysis (IPA) and ranked by *P*-value. ATAC-seq peaks were annotated with their nearest

gene using ChIPSeeker (v1.18.0) and *P*-values were calculated using Fisher's Exact Test by

IPA.

b) Diagram of the Gα 12/13 signaling pathway with selected targets including ROCK and

downstream biological processes regulated by ROCK (adapted from the IPA canonical

pathway diagram "Gα 12/13 Signaling" and previous work[86]). RhoA, Ras homolog family

member A. ROCK, Rho-associated coiled-coiled kinase. PI3K, phosphoinositide 3-kinase.

AKT, AKT serine/threonine kinase 1. NF-κB, Nuclear factor-kappa B. JNK, c-Jun N-

terminal kinase.

c) Representative images of old (21 months) cultured aNSCs/NPCs treated with H_2O vehicle

(top) or with 10 μM Y-27632 (bottom) seeded on RGD molecular tension sensors taken with

phase contrast (left) and FRET donor/acceptor fluorescence wavelengths to generate a high-

resolution traction map of FRET efficiency (right). A low FRET efficiency indicates high

force (blue color) and a high FRET efficiency indicates low force (yellow/green color). Black

dotted lines around the adhered cell bodies were generated using phase contrast images and

overlaid onto FRET images. Scale bar, 10 μm.

d) Truncated violin plot of average force per sensor (pN) in individual focal adhesions exhibited

by young (3 months) and old (21 months) cultured aNSCs/NPCs treated with H_2O vehicle or

with 10 μM Y-27632 determined using RGD molecular tension sensors (n = 85 young

aNSCs/NPCs, n = 54 young aNSCs/NPCs + 10 μM Y-27632, n = 90 old aNSCs/NPCs, and n

= 74 old aNSCs/NPCs +10 μM Y-27632) (combined over 2 separate experiments). For cells

exhibiting focal adhesion patterns, each dot represents the average force sensor reading

among focal adhesions for a single cell. For cells without any focal adhesions, each dot

represents the average force sensor reading underneath the cell body. *P*-values were

calculated using a two-tailed Mann-Whitney test.

e) Truncated violin plot of adhesion area under focal adhesions of young (3 months) and old (21

months) aNSCs/NPCs treated with H_2O vehicle or with 10 μM Y-27632 determined using

RGD molecular tension sensors (n = 85 young aNSCs/NPCs, n = 54 young aNSCs/NPCs +

10 μM Y-27632, n = 90 old aNSCs/NPCs, and n = 74 old aNSCs/NPCs +10 μM Y-27632)

(combined over 2 separate experiments). Each dot represents the adhesion area of force-

producing focal adhesions for a single cell. *P*-values were calculated using a two-tailed

Mann-Whitney test.

f) Representative images of immunofluorescence staining of an old (21-23 months old)

aNSC/NPC treated with H_2O vehicle (top) or with 10 μM Y-27632 (bottom) cultured on

Poly-D-Lysine. Blue, DAPI (nuclei); green, phalloidin (F-actin); white, high-intensity

phalloidin mask (bundled actin). Scale bar, 50 μm.

g) Fluorescence intensity of bundled actin in old (21-23 months) aNSCs/NPCs treated with H_2O

vehicle or with 10 μM Y-27632 cultured on Poly-D-Lysine, normalized to the mean levels of

the untreated condition. Each gray dot represents bundled actin levels in a single cell and

each colored dot represents the average cellular bundled actin level per animal (n = 6 old

cultures for both untreated and treated conditions) (combined over 2 experiments). Data are

mean ± SEM. *P*-values were calculated using a two-tailed Mann-Whitney test comparing

sample means between conditions.

h) Representative images of old (21-24 months) cultured aNSCs/NPCs 12 hours after sorting

onto Poly-D-Lysine-coated migration plates treated with H_2O vehicle (top) or 10μM Y-

27632 (bottom). Images were taken with the Incucyte S3 system with phase contrast and RFP

imaging overlaid. Live cells were stained with Syto64, a cell-permeant red fluorescent

nucleic acid stain, for migration tracking. Outlined inset (top-right) displays a representative

magnified cell. Scale bar, 50 μm.

i) Migration speed of young (3-4 months) and old (21-24 months) aNSCs/NPCs cultured on

Poly-D-Lysine treated with H_2O vehicle or with 10 μM Y-27632. Each dot represents the

average velocity of a single cell over a 20-hour period ($n = 9$ young control cultures, $n = 9$

young treatment cultures, $n = 7$ old control cultures, $n = 9$ old treated cultures) (combined

over 3 experiments). Data are mean ± SEM. *P*-values were calculated using a two-tailed

Mann-Whitney test.

j) Distance migrated through Matrigel after 48 hours by young (3-4 months) and old (21-23

months) cultured aNSCs/NPCs treated with H_2O vehicle or with 10 μM Y-27632. Each dot

represents the distance migrated by a single biological replicate after 48 hours ($n = 6$ young

cultures for treated and untreated conditions, $n = 6$ old cultures for treated and untreated

conditions) (combined over two experiments). For each biological replicate, 1-4 technical

replicates were evaluated, and migration distance was averaged. *P*-values were calculated

using a two-tailed Mann-Whitney test.