# Epigenetic ageing of the prefrontal cortex and cerebellum in humans and chimpanzees

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#### ABSTRACT

Epigenetic age has emerged as an important biomarker of biological ageing. It has revealed that some tissues age faster than others, which is vital to understanding the complex phenomenon of ageing and developing effective interventions. Previous studies have demonstrated that humans exhibit heterogeneity in pace of epigenetic ageing among brain structures that are consistent with differences in structural and microanatomical deterioration. Here, we add comparative data on epigenetic brain ageing for chimpanzees, humans' closest relatives. Such comparisons can further our understanding of which aspects of human ageing are evolutionarily conserved or specific to our species, especially given that humans are distinguished by a long lifespan, large brain, and, potentially, more severe neurodegeneration with age. Specifically, we investigated epigenetic ageing of the dorsolateral prefrontal cortex and cerebellum, of humans and chimpanzees by generating genome-wide CpG methylation data and applying established epigenetic clock algorithms to produce estimates of biological age for these tissues. We found that both species exhibit relatively slow epigenetic ageing in the brain relative to blood. Between brain structures, humans show a faster rate of epigenetic ageing in the dorsolateral prefrontal cortex compared to the cerebellum, which is consistent with previous findings. Chimpanzees, in contrast, show comparable rates of epigenetic ageing in the two brain structures. Greater epigenetic change in the human dorsolateral prefrontal cortex compared to the cerebellum may reflect both the protracted development of this structure in humans and its greater age-related vulnerability to neurodegenerative pathology.

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## Introduction

Studies over the last decade have established patterns of predictable methylation change at some CpG sites in the genome over the lifespan that is consistent across individuals [1–3]. These findings have led to the development of 'epigenetic clocks' that can be used to predict an individual's chronological age from methylation levels with high accuracy [2,3]. Moreover, 'epigenetic age,' or an individual's age as predicted from methylation levels using one of these epigenetic clock algorithms, is a biomarker of ageing that reflects differences in rate of development and ageing on many biological levels, including within an individual among tissues, among individuals, and among species with differing growth and senescence patterns [4-10].

In the brain, an accelerated epigenetic age has been associated with cognitive decline [11,12], agerelated neuroimaging phenotypes [11], white matter tract integrity [13], decreases in neuron proportion in the prefrontal cortex [14], and Alzheimer's disease symptoms [15,16]. Different brain regions age epigenetically at different rates [7] in ways that are consistent with observations of differences in age-related structural changes [17–19].

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Humans may also differ from other species in brain region-specific differences in rate of ageing, which could provide insights into heterochrony, or divergence in pace of organismal development or ageing, across species. Heterochrony in development can result in distinct adult phenotypes and heterochrony in ageing may reflect divergence in life history strategy [20,21] and be important for understanding aetiologies of species-specific, agerelated pathology [22]. Primate species show differences in tissue-specific patterns of methylation across the genome [23-25], some of which likely reflect the outcomes of species-specific developmental programmes. Brain ageing in nonhuman primates shares many features with humans [26-35] and some Alzheimer's disease-like neuropathology has even recently been documented in some very old great apes [36-38]. However, agerelated neuropathology, structural deterioration, and cognitive decline in nonhuman primates are thought to be generally milder than in humans [33,37,39-42].

To date, studies of epigenetic ageing in the brain have been limited and have not included primate species other than humans [7,16]. A cross-tissue epigenetic clock has been validated for chimpanzees [3,43], which can be applied to analyse the comparative neurobiology of ageing. To identify and investigate the human-specific aspects of epigenetic ageing, we examined comparative agerelated epigenetic change in the brains of both humans and chimpanzees (*Pan troglodytes*).

Chimpanzees mature earlier and do not live as long as humans [44]. Our previous work [43] has found that chimpanzees have an overall faster rate of epigenetic ageing in blood than humans, which likely reflects divergence in overall organismal ageing between the two species, and a generally faster pace of biological ageing in chimpanzees, in particular. There is variation in pace of ageing and deterioration in different organs and tissues (e.g., immunosenescence, reproductive senescence, and brain ageing may be decoupled) [45]. We aimed to assess differences between humans and our closest relatives in epigenetic ageing in the brain. We specifically studied two developmentally and functionally distinct brain structures: the dorsolateral prefrontal cortex (DLPFC) and lateral cerebellum. These two structures display evolutionary changes along the human

lineage and both may contribute to human cognitive capacities, making them promising candidates for comparative study [46–52]. Specifically, the DLPFC plays a role in distinctive aspects of human cognition related to executive functions, language use, and planning abilities [53,54]. The lateral cerebellum is relatively enlarged in humans and other great apes [46,47,52], and has extensive interconnections with cortical regions involved in the intricate sensorimotor control and sequencing of actions required for tool manipulation and language production [52,55].

For each of these structures, we profiled methylation in young and old adult humans and chimpanzees, and then compared age differences between structures and species. Because we were interested in differences in species patterns of epigenetic brain ageing rather than a simple comparison of rate of brain ageing between species, the chimpanzee and human subjects we selected for study for each age group were not of the same chronological age, but rather of equivalent relative ages, taking into account overall differences between the two species in life history pacing (see Figure 1(a)).

#### **Material and Methods**

#### Study subjects

Post-mortem brain specimens were obtained from 16 individuals (8 humans and 8 chimpanzees; see Table 1 for details). This sample size is relatively small and thus has limited power; however, it leverages precious and rare frozen tissue samples from chimpanzees. Specimens were obtained from the NIH NeuroBioBank and the National Chimpanzee Brain Resource (www.chimpanzeeb rain.org). Subjects died from causes unrelated to the current research. Causes of death and clinical diagnoses are given in Table 1. Chimpanzees showed no clinical signs of neurological conditions and no neuropathology on gross inspection of the brains at autopsy. All human samples were designated as unaffected controls by the NIH NeuroBioBank staff due to the absence of neuropathology. Although some individuals had neuropsychiatric or neurological clinical diagnoses (Table 1), they were nevertheless assigned control based status standard. extensive on



**Figure 1.** Life history stages are from [56]. Infancy is defined as birth until weaning, juvenility from weaning until menarche, adolescence from menarche until the onset of reproduction. Age at which 95% of adult brain size is attained from [57]. Age at peak reproduction is the peak proportion of females reproducing at this age and is from [58]. Chimpanzee estimate of age at first reproduction (AFR) is from wild populations and maximum lifespan (ML) estimates from captivity [44]. Human estimate of AFR based on compiled data from four contemporary hunter-gatherer groups (the Ache, Hadza, Hiwi, and!Kung) reported in [44]. Human ML (122) is also given in [44]. \*Age at last reproduction is from [59]. The estimate of 39 for humans comes from the average age at last reproduction across three forager populations. Because most female chimpanzees die before reproductive senescence, these numbers are likely not equivalent for chimpanzees. [57], give an age at last birth of 42 for chimpanzees based on an average of maximum ages of last birth in four wild chimpanzee populations and 45 for humans, but which is based again on average age at last birth, not maximum. B.Brain regions analysed and dendrograms of hierarchical clustering based on full methylation data. Samples ending in 'a' are DLPFC samples and ending in 'd' are cerebellum samples. Sample numbers 1–8 are chimpanzee samples and sample numbers 19–24 and 26 are human samples. Chimpanzee and human brain figures taken from [60].

neuropathological examination by board certified neuropathologists that includes microanatomical inspection, microscopic neuropathological assessment, and immunohistochemical assays.

We sought to match the number of males and females in each age group and species. However, we were constrained by sample availability such that males outnumbered females among the human subjects (females = 2, males = 6,) and chimpanzee females outnumbered males in the older age group (females = 5, males = 3; Table 1). For the chimpanzees, all subjects provided both DLPFC and cerebellar samples. For humans, this was the

case for all but two subjects, one of which only provided a DLPFC sample and a second that only provided a cerebellar sample (Table 1). Samples representing two age groups, young adults (humans: 34–38, chimpanzees: 20–25) and old adults (humans: 65–70, chimpanzees: 44–50), were included for each species (Figure 1a; Table 1). These ages are intended to reflect broadly equivalent whole-organism life stages, as determined based on life history stages and milestones (e.g., young adult sample ages falling during the peak reproductive years; Figure 1a). Chimpanzee brain specimens were coronally sectioned following necropsy, and

#### Table 1. Study subjects.

Brain			Hemi-	PMI			
Species	Sex	areas*	Age	sphere	(hours)	Cause of death	Clinical notes**
Pan troglodytes	F	DLPFC, cerebellum	20.7	L	<5	Congestive heart failure Lana – cardiomyopathy, congestive heart failure	
Pan troalodytes	М	DLPFC, cerebellum	24	R	<5	Coccidioidomycosis	
Pan troglodytes	F	DLPFC, cerebellum	24.5	R	<5	Epicardial haemorrhage	Gastroenteritis, uterine cyst
Pan troglodytes	М	DLPFC, cerebellum	24.9	L	<5	Staph infection	
Pan troglodytes	М	DLPFC, cerebellum	44.7	L	<5	Congestive heart failure	
Pan troglodytes	F	DLPFC, cerebellum	46.1	L	<5	Cardiomyopathy, congestive heart failure	
Pan troglodytes	F	DLPFC, cerebellum	50	L	2	Euthanized for quality of life/Obesity- related respiratory compromise and severe osteoarthritis that limited mobility	Osteoarthritis, obesity, enlarged left ventricle, prediabetic, respiratory compromise
Pan troglodytes	F	DLPFC, cerebellum	50	L	<5	Congestive heart failure	Advanced heart disease
Homo sapiens	М	DLPFC, cerebellum	34	L	26.7	Cardiopulmonary arrest	Acute lymphoid leukaemia, post-traumatic stress disorder
Homo sapiens	М	DLPFC, cerebellum	35	L	7	Cardiopulmonary arrest	Anaemia, alcohol dependence, hypertension
Homo sapiens	М	DLPFC, cerebellum	35	L	16.2	Malignant neoplasm of pancreas	Neoplasm of bronchus, lung, mediastinum, kidney, adrenal
Homo sapiens	М	DLPFC, cerebellum	38	L	23.1	Renal disease	Hyperparathyroidism, hypertension, ulcer
Homo sapiens	М	Cerebellum	65	L	10.2	Malignant neoplasm of bladder	Anxiety, Alzheimer's disease
Homo sapiens	F	DLPFC	69	L	12.6	Cardiogenic shock	Diabetes, obesity, major depressive disorder
Homo sapiens	F	DLPFC, cerebellum	67	L	3.75	Cardiopulmonary arrest	Atherosclerosis, cardiac dysrhythmia
Homo sapiens	Μ	DLPFC, cerebellum	70	L	10.1	Cardiopulmonary arrest	Gout, pseudobulbar affect; multiple sclerosis, cataracts, diplopia, papilloedema, hypertension, cerebral infarction, cognitive deficits, memory loss, chronic fatigue syndrome, dysphagia, urinary frequency

\*DLPFC = Dorsolateral prefrontal cortex.

\*\*Note on human subjects: All human subjects were designated by as free from neuropathology and characterized as unaffected controls by NIH NeuroBioBank staff following a rigorous, standardized pathology detection procedure.

sections were then kept frozen at -80°C. Predissected, snap-frozen, and pulverized human brain specimens were received from the NIH NeuroBioBank (Mount Sinai Brain and Tissue Repository).

# **Tissue dissection**

Brain structures were dissected from frozen chimpanzee brain sections while kept chilled on dry ice using published species-specific brain atlases [46,61,62]. In the DLPFC, we analysed Brodmann's area 46, which lies in the middle frontal gyrus in both humans and chimpanzees, and, in the lateral cerebellum ('cerebellum' hereafter), the lateral-most part of the posterior lobe (Crus I and Crus II) (Figure 1(b)). We stored dissected tissue at  $-20^{\circ}$ C in microcentrifuge tubes filled with RNALater (Ambion, Austin, TX, USA) preservation buffer until we performed DNA extractions.

# DNA extraction and microarray analysis

Tissues were washed with PBS buffer to remove residual RNALater and DNA was then extracted from dissected tissue using the DNeasy Blood and Tissue Kit (Qiagen, Hilden, Germany) following the manufacturer's protocol. All DNA sample concentrations were measured on a Nanodrop spectrophotometer (Thermo Fisher Scientific, Waltham, MA, USA) and then brought to a concentration of  $\sim$ 70 ng/µl, either through dilution with PCR-grade water or concentration using Microcon-30kDa Centrifugal Filter Unit columns (Millipore Sigma, Burlington, MA, USA). DNA was then bisulphite-converted and assayed on the Illumina Infinium Methylation EPIC BeadChip at the Yale Center for Genome Analysis. Individuals from all species and age groups were included in each DNA extraction and on each array to avoid confounding batch effects.

## Data preprocessing

We preprocessed data with the ChAMP v2.12.4 R package [63]. This included filtering the raw intensity data for probes with background-level spectral intensities that target non-CpG sites, that contain known DNA sequence variants, that target sites on sex chromosomes, and for which there were fewer than 3 reads for at least 5% of the samples. The data were normalized using Beta Mixture Quantile dilation (BMIQ), which corrects for differences in the distribution of type 1 and type 2 probes on the array by adjusting type 2 probe methylation values to fit the type 1 probe distribution [64]. We performed singular value decomposition analysis [65] to identify significant sources of covariation and batch effects in the data. The main sources of variance were species, brain structure, and age (p < 0.001), as well as individual identity (p < 0.05). Sex and batch had no significant effects. To further exclude the presence of major confounds in our data, we also performed hierarchical clustering of samples based on genome-wide methylation after filtering and normalizing using Euclidean distance between samples. Samples clustered by species and, within species, by region (Figure 1(b)).

# Epigenetic clock analysis

We leveraged a dataset we generated for a prior study [66] to estimate epigenetic age of both brain structures of all human and chimpanzee individuals using an established human multi-tissue epigenetic clock, known as the 'Horvath clock' [3], which has been demonstrated to estimate chimpanzee age accurately from blood [3,43]. Age estimation using the Horvath clock is done via prediction using a linear equation including 353 age-predictive CpG sites (the CpGs and their coefficients can be found at the clock's dedicated website https://horvath.genetics.ucla.edu/html/dna mage/; AdditionalFile3.csv contains the model). Age estimation with the Horvath clock also involves an age-transformation function in which age-related methylation change is logarithmic until attainment of adult age (20), after which the relationship is linear. We also estimated chimpanzee epigenetic age using the Horvath clock with adult ages of 15 and 10, which may better reflect adult age in wild and captive chimpanzees, respectively [67-69]. We additionally used a chimpanzeespecific blood epigenetic age estimator that our group recently developed [43]. The chimpanzee clock functions to predict age using a linear equation in the same way as the Horvath clock. The CpGs and coefficients comprising the chimpanzee clock can be found in the supplementary material of [43]. We used analysis of covariance to assess whether the different brain structures showed significant differences in slope, or rate of epigenetic ageing, in each species. Specifically, we used the base function aov in R v3.6.1 [70] to fit linear models with natural log-transformed epigenetic age [71,72] as the outcome variable and chronological age, region, and an interaction between chronological age and region as the predictor variables. Sex, hemisphere, post-mortem interval (PMI), and neurological diagnoses were included as covariates.

# Ethics

Brain specimens were obtained from the NIH NeuroBioBank and the National Chimpanzee Brain Resource with the approval of The George Washington University Institutional Animal Care and Use Committee (Protocol #A454). No living animals were used. We followed guidelines for the ethical use of chimpanzees in research laid out by the American Psychological Association and National Institutes of Health during all aspects of this research and complied with the American Association of Biological Anthropologists Code of Ethics.

# Results

In humans, the Horvath clock resulted in epigenetic age estimates that showed a moderately high correlation ( $r_s = .74$ , p = 0.058) with chronological age and fairly accurate age estimates (median absolute deviation, MAD, of 5.0 years) in the DLPFC. The correlation was stronger ( $r_s = .85$ , p = 0.016) but the MAD somewhat higher (6.2 years) in the cerebellum. The ages for all individuals in the older age group were underestimated by the clock in both brain structures, but much more so in the cerebellum (Figure 2). The ages of all young adults were overestimated in the cerebellum, while the ages of most young individuals (three out of four) were underestimated in the DLPFC.

In chimpanzees, Horvath clock epigenetic age estimates were also more highly correlated with chronological age in the cerebellum ( $r_s = .83$ , p=0.009) than in the DLPFC ( $r_s = .59, p=0.126$ ). The age predictive accuracy of the Horvath clock was reduced in chimpanzees compared to humans, and was more accurate in the cerebellum (MAD 9.37 years) than the DLPFC = (MAD = 16.9 years; Figure 2). Using an age transformation with adult age set to either 15 or 10 years, to potentially reflect the earlier attainment of reproductive maturity in chimpanzees, did not improve chimpanzee age estimation in either brain structure but instead led to higher MADs (with a 15-year adult age: DLPFC = 21.3; cerebellum = 15.6; with a 10-year adult age: DLPFC = 25.8; cerebellum = 21.9). The chimpanzee-specific blood clock did not produce high correlations between predicted and chronological age in the cerebellum ( $r_s = .56$ , p = 0.146) and showed a MAD of 9.56 years. Although the DLPFC showed a higher correlation between predicted and chronological age ( $r_s = .92$ , p = 0.001), the MAD was 14.4 and all of the old individuals' ages were underestimated by at least 21.5 years.

Analysis of covariance revealed a significant difference in slopes between the two brain regions in humans (F(1,7) = 7.73, p = 0.027) but not in chimpanzees (F(1,10) = 1.05, p = 0.330) using the Horvath clock (Table 2, Figure 2). A significant difference in slopes between the two brain regions was detected in chimpanzees, however, using the chimpanzee-specific blood clock (F(1,10) = 5.34, p = 0.043).

## Discussion

Our analysis found that human and chimpanzee brains show less age-related change in methylation compared to what has previously been observed in blood [2,43,73], which is consistent with previous studies in humans [16,74]. Within the brain, we found that in young adult humans the DLPFC tends to be epigenetically younger than the cerebellum. An epigenetically young DLPFC in early adulthood could reflect this structure's extended development [75-77]. However, protracted development does not appear to keep the DLPFC epigenetically young after its maturation in humans. Rather, the cerebellum is epigenetically younger in old individuals (Figure 2), which is consistent with prior studies [7]. This result may be reflective of evidence in humans that the prefrontal cortex also shows earlier and greater structural, microanatomical, and neurochemical change in senescence than other neocortical areas, including white matter shrinkage, grey matter atrophy, loss of dendritic spines, reduced synaptic density, altered myelin, reduced blood flow, and reduced dopamine binding [18,29,54,78-84]. Such age-related changes of the prefrontal cortex are hypothesized to be a major driver of cognitive decline [28,34,35,54,83,85].

We found that chimpanzees also show epigenetically young DLPFCs in early adulthood, potentially reflecting that chimpanzees, like humans, also exhibit protracted aspects of neurodevelopment in the prefrontal cortex relative to macaque monkeys [86]. However, in contrast to humans, we found that in chimpanzees the DLPFC remained epigenetically younger than the cerebellum in older adulthood (Figure 2). Chimpanzees exhibit age-related grey matter atrophy, which, as in humans, is more marked in certain cortical regions, including the prefrontal cortex [62,83]. Microanatomical age-related change in the DLPFC has not been extensively studied in chimpanzees. However, some recent work has documented Alzheimer's disease-like pathology in the prefrontal cortex in very old chimpanzees [36,37].



Figure 2. Epigenetic age estimates using the Horvath clock for humans and chimpanzees and results of the ANCOVA. A & B: Spearman's rho is shown for each species (A = humans, B = chimpanzees) and region. C & D: Results of the ANCOVA comparing slopes of ageing for each region for (c) humans and (d) chimpanzees, along with the regression equations for each line. CB = cerebellum, DLPFC = dorsolateral prefrontal cortex.

Effect	DFn	DFd	F	р	Partial η <sup>2</sup>
Age	1	7	30.75	0.000864***	0.815
Region	1	7	1.06	0.34	0.031
Sex	1	7	0.10	0.76	0.014
Neurologic diagnosis	1	7	0.0002	0.99	0.00002
PMI	1	7	1.24	0.30	0.150
Age*Region	1	7	7.73	0.027*	0.525
		Chimpanzees (Pan tro	oglodytes)		
Effect	DFn	DFd	F	Ø	Partial n <sup>2</sup>
Age	1	10	49.96	0.00003***	0.833
Region	1	10	19.15	0.001**	0.657
Sex	1	10	2.15	0.174	0.177
Hemisphere	1	10	0.003	0.960	0.0003
Age*Region	1	10	1.050	0.330	0.095

Table 2. Results of the covariance analysis.

Chimpanzees show age-related declines in cognitive performance that have been shown to be associated with age-related grey matter structure

changes in several brain regions, including the prefrontal cortex, but which are overall relatively mild [87,88]. It remains to be determined,

however, whether differences in brain ageing phenotypes, for example in the prefrontal cortex, between humans and chimpanzees might contribute to potential attenuated cognitive decline in chimpanzees. Generally, more severe and prevalent pathology and cognitive decline in old humans than in nonhuman primates [33,37,39– 42] has been hypothesized to be due to an extended lifespan or to the consequences of the greater burden of oxidative damage resulting from increased energy metabolism [89,90]. Improved knowledge in this area is of particular interest given our finding here of differences between humans and chimpanzees.

A number of our study's limitations and caveats warrant discussion. Our epigenetic age estimates are only moderately correlated with chronological age in the prefrontal cortex, likely due to the small sample size; our epigenetic age estimates obtained with the Horvath clock may nevertheless be considered reasonable biomarkers of ageing given this clock was trained on brain tissue among many other tissues [3], has been validated in independent brain datasets [7], and is associated with brain-specific age-related pathology [16]. In contrast, our chimpanzee-specific epigenetic clock based on blood methylation profiles [43] does not accurately predict chimpanzee age from brain tissue, suggesting it should be considered a bloodor possibly non-neural tissue-specific ageing indicator. This is consistent with findings of poor performance in brain for human epigenetic clocks trained on blood and saliva [91]. Although we did find differences in the slope of epigenetic ageing between the prefrontal cortex and cerebellum for chimpanzees using the chimpanzee blood clock, the prefrontal cortex was nevertheless epigenetically younger than the cerebellum at both old and young ages in chimpanzees, as we found with the Horvath clock for chimpanzees and in contrast to our and others' findings in humans [7]. Given the higher age-predictive accuracy of the Horvath clock and its validation in brain, the results using the Horvath clock are more reliable. Nevertheless, a multi-tissue or brain-specific, chimpanzeespecific clock would further clarify the degree of divergence in region-specific patterns of epigenetic ageing in humans and chimpanzees. In addition, data from more species - ideally other apes like gorillas for which CpG sites are likely to be conserved – would be necessary to confirm whether differences in patterns of ageing between brain regions, if any, are ancestral or derived.

In addition, as noted in prior studies [7], differences in cell type composition may contribute to differences among regions, as well as species, in epigenetic ageing. Humans have more glial cells per neuron in several areas of the prefrontal cortex compared to other anthropoid primates [51]. Variation in sample conditions, like storage, could also potentially produce artefacts in our data. This type of non-ideal experimental variation can unfortunately result as the consequence of the exceedingly limited availability of human and nonhuman primate tissues [92]. However, methylation fortunately has much higher 'technical reliability,' than, for example, RNA, meaning that it is more stable and robust to differences in PMI or storage condition [93–97]. It is thus unlikely that technical artefacts are a major issue in the current study. Finally, the differences between chimpanzees and humans may partly reflect the selected ages of individuals in each of the two age groups, which differ among species in this study (Figure 1a). We sought to select life history-equivalent ages, given differences in developmental timing and lifespan between species and previous evidence of scaling of epigenetic ageing with lifespan [43,98]. However, the contributions of absolute versus life history-scaled age to brain epigenetic ageing are unclear. Nevertheless, the older chimpanzees in our study are of chronological ages (44-50 years) at which the ageing trajectories of the two brain structures, if approximately linear, would begin to converge in humans (at the end of 5th decade; Figure 2), yet the two structures retain nearly parallel trajectories in chimpanzees (Figure 2). Sampling from additional ages would further clarify this phenomenon. A larger sample size for the two species examined here including samples representing more ages over the lifespan would also provide greater information about regionspecific species differences in epigenetic ageing trajectory.

In conclusion, we found evidence for differences between humans and chimpanzees in epigenetic ageing in brain structures that may have undergone accelerated evolutionary change in the human lineage. In particular, we found that although the human DLPFC is epigenetically young early in life, its pace of age-related epigenetic change after young adulthood is fast compared to the cerebellum and relative to chimpanzees. This interspecific divergence in ageing patterns between structures may be reflective of species differences in development and senescence, and may be driven by differences in energy metabolism as well as structure-specific cell type proportions [51,89,90]. These results provide a comparative context for understanding agerelated epigenetic change in the brain and indicate plasticity of ageing trajectories across tissues and species.

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No potential conflict of interest was reported by the authors.

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#### Data availability statement

Metadata, raw spectral intensity data, and normalized beta value data are available in NCBI's Gene Expression Omnibus (https://www.ncbi.nlm.nih.gov/sra) under accession GSE154403. R code used for all analyses is available on www.chimpanzeebrain.org.

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