

1 **Epigenetic aging and musculoskeletal outcomes in a cohort of women living with HIV**

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43 **Abstract**

44 **Background:** The relationship between accelerated epigenetic aging and musculoskeletal outcomes in
45 women with HIV (WWH) has not been studied.

46 **Methods:** We measured DNA methylation age using the Infinium MethylationEPIC BeadChip in a cohort
47 from the Women's Interagency HIV Study (N=190) with measures of bone mineral density (BMD) and
48 physical function. We estimated six biomarkers of epigenetic aging: epigenetic aging acceleration (EAA),
49 extrinsic epigenetic age acceleration (EEAA), intrinsic epigenetic age acceleration (IEAA), GrimAge,
50 PhenoAge, and DNA methylation-estimated telomere length (DNAmTL) and evaluated associations of
51 epigenetic aging measures with BMD and physical function. We also performed epigenome-wide
52 association studies (EWAS) to examine associations of DNA methylation signatures with BMD and physical
53 function.

54 **Results:** 118 WWH (mean age 49.7 years; 69% Black) and 72 without HIV (mean age 48.9 years; 69% Black)
55 were included. WWH had higher EAA (1.44 ± 5.36 vs. -1.88 ± 5.07 , $p < 0.001$) and lower DNAmTL (7.13 ± 0.31
56 vs. 7.34 ± 0.23 , $p < 0.001$) than women without HIV. There were no significant associations between
57 accelerated epigenetic aging and BMD. Rather, measures of accelerated epigenetic aging were associated
58 with lower physical function.

59 **Conclusions:** Accelerated epigenetic aging was observed in WWH compared to women without HIV and
60 associated with lower physical function in both groups.

61 **Key Words:** bone mineral density, osteoporosis, menopause, HIV, aging, women, EWAS, epigenetic aging,
62 physical function

63

64

65 **Introduction**

66 Adults with HIV appear to have a higher prevalence of frailty, poor physical function, and osteoporosis
67 than age- and sex-matched adults without HIV [1,2]. For women with HIV (WWH), conditions of
68 musculoskeletal aging, including osteoporosis and fractures, occur more frequently after the menopausal
69 transition, and the differences in prevalence between WWH and women without HIV are greater among
70 postmenopausal women [3].

71

72 DNA methylation (DNAm), specifically methylation of 5'-cytosine in CpG-rich regions of DNA, is the most
73 commonly studied epigenetic change due to its stability and accessibility [4,5]. DNAm age correlates with
74 chronological age, and individuals with increased DNAm age compared to their chronological age have
75 epigenetic age acceleration [6]. There are a number of methylation-based biomarkers of aging (i.e.
76 epigenetic clocks) that measure age acceleration, including epigenetic age acceleration (EAA), extrinsic
77 epigenetic age acceleration (EEAA), intrinsic epigenetic age acceleration (IEAA), GrimAge, and PhenoAge,
78 as well as a DNA-methylation estimator of telomere length (DNAm-TL) [6–10]. Accelerated epigenetic age
79 by DNAm has been reported among adults with HIV [11–15]; however, most of the data are in men.

80

81 Few studies have examined the relationship between epigenetic age acceleration and bone mineral
82 density (BMD) or physical function in WWH. A study in children did not find any evidence of accelerated
83 epigenetic aging at birth or age 7 with BMD [16]. A previous study showed that increased DNAm of *Alu*, a
84 cluster of interspersed DNA elements, is associated with accelerated aging and lower BMD in post-
85 menopausal women with osteoporosis [17]. In the general population, GrimAge was found to be
86 associated with a decline in physical function, including lower performance on 6-minute and 10-meter
87 walk tests and knee extension and ankle plantar flexion strength tests, over three years of follow up in
88 older women [18].

89

90 In the primary analysis of the Women’s Interagency HIV Study (WIHS) Musculoskeletal Substudy (MSK) of
91 pre-, peri-, and post-menopausal women, we found that WWH had lower areal BMD (aBMD) by dual
92 energy X-Ray absorptiometry (DXA) and lower volumetric BMD by quantitative computed tomography
93 than age- and race/ethnicity-matched women without HIV [3]. In this secondary analysis, we compare
94 methylation-based biomarkers of aging between WWH and women without HIV and evaluate associations
95 of epigenetic age acceleration with BMD and physical function. We explore associations with DNAm
96 signatures using large-scale epigenome-wide association studies (EWAS) to identify potentially modifiable
97 mechanistic pathways.

98 **Methods**

99 **Study participants**

100 This analysis includes data from participants in the WIHS MSK, which enrolled 250 WIHS participants aged
101 40-60 years from 3 WIHS sites (San Francisco, Bronx, and Chicago) with HIV who were on ART for >1 year
102 and had CD4>100 cells/ μ l, and a comparison group of women without HIV with similar age, ethnicity, and
103 risk behaviors [3]. Exclusion criteria for the MSK included weight >264 lbs, height greater than 6'1",
104 pregnant or breastfeeding in the past 6 months, estimated glomerular filtration rate by MDRD of <60
105 ml/min/1.73m², and current hormone replacement therapy, osteoporosis treatment, or glucocorticoid
106 use. For this epigenetic analysis, a total of 195 samples were selected, including 89 from the Bronx, 65
107 from San Francisco, and 41 from Chicago WIHS sites. This study was approved by the Institutional Review
108 Boards of all participating institutions and informed consent was provided by all participants.

109

110 **Measurements**

111 ***Demographics and clinical characteristics:*** Demographic and clinical information on age, race (Black vs.
112 non-Black), weight, body mass index (BMI), menopausal stage defined using SWAN (Study of Women's
113 Health Across the Nation) study [3,19], substance use, and co-morbidities were extracted from the WIHS
114 database. HIV-related variables included information on CD4 count, HIV-RNA level, and use and type of
115 antiretroviral regimens.

116

117 ***Bone mineral density:*** DXA was utilized to measure aBMD at the lumbar spine and total hip. DXA scans
118 were performed using Lunar Prodigy densitometers (GE Medical Systems, Madison WI) at all WIHS MSK
119 study sites and read centrally at the Image Analysis Lab (New York, NY) as described previously [3].

120

121 **Physical function:** A battery of muscle strength, walking speed, balance and endurance measures was
122 developed based upon the Baltimore Longitudinal Study on Aging (BLSA) and other aging cohorts [20,21].
123 Muscle strength was assessed by grip strength [22] and repeated chair stands. For grip strength, the
124 participant was asked to hold a hand-held Jamar dynamometer with their dominant hand and squeeze
125 with maximum force in kg, and the best of three attempts was utilized in analysis. For the repeated chair
126 stand, the participant was asked to stand from a seated position without the aid of their arms. The time
127 to completion of 10 repetitions was recorded to minimize the ceiling effect for higher functioning women
128 [23]. Walking speed was defined by the faster of two measurements at a “normal, comfortable pace” over
129 a 4-meter course. Endurance was assessed by a 400-meter walk, which measures time taken to complete
130 a 400-meter walk. Static balance was assessed with the 4-stage Standing Balance Test (parallel, semi-
131 tandem, tandem, and single-leg) [24], with the duration that subjects were asked to hold each position
132 increased to 30 seconds to reduce possibility of a ceiling effect [25]. Only data from the single-leg stance
133 test were included here. The functional reach test was also performed, with results reported as the mean
134 scores of 3 reaches, where each individual would slide their hand as far forward as they could without
135 losing their balance or taking a step [26].

136
137 **DNA extraction and genome-wide methylation profiling:** DNA was extracted using the Qiagen QIAmp
138 DNA Blood Midi Kit (Qiagen, Germantown, MD) and quantified using the Qubit dsDNA BR Assay Kit and
139 Qubit Fluorometer (Thermo Fisher Scientific, Waltham, MA) at CUIMC. DNAm levels were measured using
140 the Infinium MethylationEPIC BeadChip v1.0 (Illumina, San Diego, CA) at Roswell Park Cancer Institute
141 (Buffalo, NY). Genomic DNA (50ng/μL) was isolated and quantified with PicoGreen (Thermo Fisher
142 Scientific, Waltham, MA) from PBMCs of the 195 participants. The Infinium Methylation EPIC BeadChip
143 v1.0 arrays (Illumina, Inc., San Diego, CA) which interrogate ~850,000 CpG sites, were run at the
144 Northwestern University Genomics Core Facility according to the manufacturer’s protocol. Briefly,

145 genomic DNA samples were bisulfite converted using the EZ DNA Methylation kit (Zymo Research Col,
146 Irvine, CA). Samples were amplified, enzymatically fragmented, and hybridized to the BeadChips.
147 Following hybridization, the chips were stained, washed, and scanned using the Illumina HiScan System.
148 Raw intensity data (IDAT) files were obtained.

149
150 **Bioinformatics pre-processing of DNA methylome data:** Standard pre-processing pipeline procedures,
151 including filtering, quality control and dye-bias correction were performed with the R package *ewastools*
152 v1.5 [27,28]. Control metrics were checked for quality control. With the threshold of SNP outliers set as -
153 4, five samples were removed, for a total of 190 remaining for analysis. A total of 843,393 CpG sites were
154 obtained after removing the control probes, non-CpG probes, failed probes with detection p-value ≥ 0.05 ,
155 SNP-enriched probes, probes demonstrated to cross-hybridize non-specifically in the genome, and sex
156 chromosome probes. Estimated proportions of six different cell types (B-cells, CD4 T-cells, CD8 T-cells,
157 natural killer cells, granulocytes, monocytes) were estimated using the Houseman method [29].

158
159 **DNA methylation age:** Estimated DNAm age in years was obtained from the online calculator
160 (<https://dnamage.genetics.ucla.edu/>) developed by Horvath [6]. Six methylation-based biomarkers of
161 aging were calculated: (1) epigenetic age acceleration (*EAA*), (2) extrinsic epigenetic age acceleration
162 (*EEAA*), (3) intrinsic epigenetic age acceleration (*IEAA*), (4) *GrimAge*, (5) *PhenoAge*, and (6) DNAm-
163 estimated telomere length (*DNAmTL*). *EAA* is the (raw) residual resulting from regressing the Horvath-
164 estimated DNAm age estimate on chronological age [6]. *EEAA* is the residual resulting from regressing the
165 Hannum-estimated DNAm age up-weighted for the contributions of age-related blood cell counts on
166 chronological age [30,31]. *IEAA* is the residual resulting from regressing the Horvath-estimated DNAm
167 age on chronological age + CD8.naive + CD8pCD28nCD45RAn + PlasmaBlast + CD4T + NK + Mono + Gran.
168 *GrimAge* is based on 1030 CpG sites that predicts time-to-death [8]. *PhenoAge* is based on 513 CpG sites

169 that predict morbidity and mortality [9]. For these five measures, positive values indicate that the
170 participant's biological age is older than expected based on chronological age and negative values indicate
171 that the participant's biological age is younger than expected based on chronological age. The final
172 measure *DNAmTL* estimates telomere length, where a shorter telomere length is indicative of accelerated
173 biological aging [32].

174

175 **Statistical analysis**

176 Continuous variables were descriptively summarized by means and standard deviations and categorical
177 variables by percentages. Comparisons between WWH and women without HIV were performed using t-
178 tests for continuous variables and Fisher's exact tests for categorical variables. Biomarkers of epigenetic
179 aging were compared between groups using t-tests and linear regression, unadjusted and adjusted for
180 race and smoking status. Associations between biomarkers of epigenetic aging and continuous measures
181 of bone and physical function were assessed using linear regression models.

182

183 For EWAS analyses, we fit a model using the empirical Bayes moderated linear regression approach
184 implemented by *limma* [33] with DNAm as the dependent variable and HIV status as the primary
185 independent variable. We conducted an unadjusted analysis as well as an analysis adjusted for age, race,
186 and smoking status. CpG sites were considered to be differentially methylated if they had an p-value
187 meeting the Holm-Bonferroni threshold ($p < 5.92 \times 10^{-8}$) and $|\Delta\beta| > 0.05$, where $\Delta\beta$ is the mean difference
188 between the average DNAm of the groups. Gene annotations used in the analysis were based on the
189 IlluminaHumanMethylationEPICanno.ilm10b2.hg19 database [34]. All analyses were performed using R
190 statistical software (version 4.1.2).

191 **Results**

192 **Characteristics of study population**

193 A total of 118 WWH (mean age 49.7 years; 69% Black) and 72 women without HIV (mean age 48.9 years;
194 69% Black) were included, and characteristics are shown in **Table 1**. WWH had similar weight and BMI
195 compared to women without HIV (**Table 1**). WWH were less likely to be a current smoker compared to
196 women without HIV. Among the WWH, median (IQR) CD4 count was 567 (467-756) (cells/mm³) and 72%
197 had an HIV RNA <50 copies/mL. WWH had lower BMD T-scores at the lumbar spine and total hip compared
198 to women without HIV. There was little difference in physical function measures (grip strength, repeated
199 chair stand, walk speed, single-leg stand, and functional reach) between women with or without HIV.

200

201 **HIV**

202 WWH had a significantly higher EAA (1.44±5.36 vs -1.88±5.07, p<0.001) and a lower DNAmTL (7.13±0.31
203 vs 7.34±0.23, p<0.001) compared to women without HIV (**Figure 1**). EEAA, IEAA, GrimAge, and PhenoAge
204 were not significantly different between groups. Findings were similar when adjusted for smoking status
205 and race.

206

207 In an unadjusted model, we identified 2,286 differentially methylated CpG sites associated with HIV that
208 met the Holm-Bonferroni threshold and had $|\Delta\beta|>0.05$. In a model adjusted for age, race, and smoking
209 status, we identified 2,094 differentially methylated CpG sites associated with HIV. The top 50 CpG sites
210 are shown in **Supplemental Table 1**.

211

212 **Bone**

213 There were no differences in biomarkers of aging between women with and without a lumbar spine BMD
214 T-score <-1 or between women with and without a total hip BMD T-score <-1 for the overall cohort (**Table**

215 **2).** Among WWH, there were also no differences between groups (data not shown). Among women
216 without HIV, EAA was significantly lower for those with a lumbar spine BMD T-score <-1 compared to
217 those with a lumbar spine BMD T-score >-1 (-5.43±3.25 vs. -1.35±5.14). When examining continuous bone
218 outcomes for the overall cohort, greater lumbar spine BMD ($\beta=0.238$, 95%CI: 0.010, 0.467, $p=0.04$) and
219 total hip BMD ($\beta=0.316$, 95%CI: 0.029, 0.602, $p=0.03$) were associated with increased DNAmTL.

220
221 In an EWAS, no BMD measures (lumbar spine T-score, lumbar spine BMD, total hip T-score, or total hip
222 BMD) were associated with DNAm. No CpG sites met criteria for association (Holm-Bonferroni significance
223 and $|\Delta\beta|>0.05$).

224

225 **Physical function**

226 We examined associations between biomarkers of aging and various measures of physical function.
227 Women who could not hold a single-leg stand for 30 seconds (N=112) had higher EAA, EEAA, IEAA,
228 GrimAge, and PhenoAge, and lower DNAmTL compared to women who could hold the single-leg stand for
229 30 seconds (N=78) (**Table 3**). When stratified by HIV status, WWH who could not hold a single-leg stand
230 for 30 seconds had higher EEAA (2.17±8.30 vs. -0.95±7.34, $p=0.03$), GrimAge (0.78±5.03 vs. -1.51±4.47,
231 $p=0.01$) and PhenoAge (2.01±7.23 vs. -1.29±7.09, $p=0.01$) compared to WWH who could hold the single-
232 leg stand for 30 seconds (**Supplemental Table 2**). For women without HIV, those who could not hold a
233 single-leg stand for 30 seconds had higher EAA (-1.02±5.38 vs. -3.32±4.22, $p=0.048$) and lower DNAmTL
234 (7.30±0.24 vs. 7.41±0.20, $p=0.045$) compared to those who could hold the single-leg stand for 30 seconds
235 (**Supplemental Table 2**).

236

237 Longer time holding a single-leg stand was associated with lower EEAA ($\beta=-0.141$, 95%CI: -0.274, -0.009,
238 $p=0.037$) and PhenoAge ($\beta=-0.145$, 95%CI: -0.278, -0.011, $p=0.033$) (**Table 4**). The time in seconds to

239 complete 10 repeated chair stands was associated with greater GrimAge acceleration ($\beta=0.147$, 95%CI:
240 0.031, 0.263, $p=0.013$) and lower DNA telomere length ($\beta=-0.008$, 95% CI: -0.015, -0.001, $p=0.032$). Longer
241 time to complete a 4-meter walk in seconds was associated with higher PhenoAge ($\beta=2.227$, 95%CI: 0.918,
242 3.542, $p=0.001$).

243

244 We then performed EWAS of the association between DNAm and physical function. No CpG sites met
245 criteria for association (Holm-Bonferroni significance and $|\Delta\beta|>0.05$).

Not for Dissemination

246 **Discussion**

247 We report for the first time in a sample of only women (ages 40-60 years) that WWH have a higher EAA
248 and shorter DNAmTL compared to women without HIV. Accelerated aging among adults with HIV has
249 been demonstrated using various epigenetic aging estimates in samples with mostly men [14,15]. WWH
250 are important to study given that globally over 50% of people living with HIV are women, and women
251 accounted for an estimated 49% of all new infections in 2021 [35]. Our finding of accelerated epigenetic
252 age in a cohort of older WWH (mean age 49.7 years) is an important addition to the literature on
253 differences in aging among PWH by biological sex [36].

254
255 We found associations between epigenetic age acceleration and measures of physical function including
256 balance and gait speed. Similar findings for some but not all the measures were observed when stratified
257 by HIV status, possibly due to smaller sample sizes. In a study of women at ages 53 and 64 enrolled in the
258 National Survey for Health and Development, baseline epigenetic age acceleration was not associated
259 with balance, in contrast to our findings [37]. A study of 63-76 year-old women from the Finnish Twin
260 Study on Aging found an association between higher GrimAge and decreased performance in 6-minute
261 and 10-meter walk tests, but did not conduct a 4-meter walk test as used in our study [18].

262
263 Two prior studies found associations between increased epigenetic age and decreased grip strength
264 [37,38]. Despite these previous results, we found no associations of any epigenetic aging measures in our
265 study with grip strength. A recent longitudinal study did not find an association of any epigenetic aging
266 measure with functional assessments covering different domains of aging (e.g. frailty, mobility, ability to
267 perform activities of daily living) [39]. Given inconsistent findings, additional research is needed to further
268 corroborate these findings, particularly in cohorts of WWH.

269

270 Contrary to our hypothesis, we did not find any associations between epigenetic aging measures and bone
271 outcomes. This is consistent with a small non-HIV study of 32 individuals with osteoporosis and 16 controls
272 which found no association between bone parameters and HorvathAge acceleration [40]. The lack of
273 findings in that study and ours could be due to a lack of power for these outcomes and additional larger
274 studies are needed.

275
276 Similar to other studies, we found a large number of CpG sites associated with HIV. The top differentially
277 methylated CpG site (cg07839457) was located on the gene *NLRC5*, which encodes a transcription factor
278 that regulates major histocompatibility complex (MHC) class I molecule expression. This CpG site has also
279 been implicated in other studies of both children and adults with HIV [11,41]. In contrast to a study
280 comparing bone samples of 27 osteoporotic and 23 osteoarthritic patients which identified 241
281 differentially methylated CpG sites [42], our EWAS analyses did not identify any associations between
282 BMD and DNAm from blood samples. A recent EWAS of BMD in European individuals profiled DNAm in
283 blood and only found one CpG site, cg23196985, located on the 5' untranslated region of *CES1*, to be
284 significantly associated with femoral neck BMD in women [43]. These studies have yet to be replicated,
285 and used older Illumina arrays, including the HumanMethylation27 BeadChip (~27,000 CpG sites) and the
286 HumanMethylation450 array (~450,000 CpG sites), respectively. Genome-wide association studies
287 (GWAS) of BMD by DXA in the general population have identified variants at 73 trait-associated genetic
288 loci, including several associated with fracture risk [44,45]. While genetic advances may pave the way for
289 precision medicine in osteoporosis, genetic variants explain only 5-12% of the total phenotypic variance
290 in BMD. Beyond genetics, many other environmental, lifestyle factors, medications, and health conditions
291 affect BMD, including hormone levels, tobacco and alcohol use, physical activity, and other comorbidities
292 [46–48].

293

294 For physical function measures, there were also no associations at a Holm-Bonferroni threshold and a
295 5% methylation difference. Similarly, other EWAS studies of grip strength in the general population have
296 not reported significant findings [38,43,49]. Taken together, there is limited evidence to support
297 associations between epigenetic changes and physical function. Larger studies and longitudinal studies
298 are needed to more fully assess these potential associations.

299
300 Our study is limited by its cross-sectional design. There could be reverse causation, such that a change in
301 physical function could result in changes in DNAm, as opposed to the direction we hypothesized. We also
302 did not adjust for inflammatory biomarkers or other factors that could be associated with both DNAm
303 change, BMD, and physical function. Lastly, a major limitation for all DNAm studies is tissue specificity.
304 Epigenetic changes may be tissue-specific and we do not have bone or muscle-specific DNAm data. Of
305 note, women without HIV had higher rates of tobacco use, cocaine, and alcohol use in our study. Given
306 evidence that these substances can be associated with increased accelerated epigenetic aging, our finding
307 of accelerated aging in WWH may be conservative [50].

308
309 In conclusion, we found evidence of associations between certain methylation-based biomarkers of aging
310 and measures of physical function in a cohort of WWH and women without HIV but did not find any
311 significant associations in EWAS analyses with either BMD or functional outcomes. Future studies will
312 need to assess whether these findings persist longitudinally, and to evaluate the directionality of these
313 associations.

314

315

316 **Data availability**

317 Data are available upon request.

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431 **Figure Legends**

432

433 **Figure 1:** Box plots of A) EAA, B) EEAA, C) IEAA, D) GrimAge, E) PhenoAge, and F) DNAmTL in women
434 with HIV (HIV+, N=118) and women without HIV (HIV-, N=72). Comparisons between groups performed
435 using t-tests. P-value <0.05 is indicated by asterisks (***) . Abbreviations: DNAm-TL, DNAm-based
436 telomere length; EAA, epigenetic age acceleration; EEAA, extrinsic epigenetic age acceleration; HIV,
437 human immunodeficiency virus; IEAA, intrinsic epigenetic age acceleration.

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