

1 **ARTICLE:**

2 **Title: Semaglutide Slows Epigenetic Aging in People with HIV-associated**
3 **lipohypertrophy: Evidence from a Randomized Controlled Trial**

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Abstract

Semaglutide is a once-weekly GLP-1 receptor agonist that has been proposed as a gerotherapeutic, yet no data exist on its effects on epigenetic aging. We therefore conducted a post-hoc epigenetic analysis of a 32-week, double-blind, placebo-controlled phase 2b trial in adults with HIV-associated lipohypertrophy (semaglutide n = 45; placebo n = 39). Paired peripheral-blood methylomes were profiled to evaluate semaglutide's impact across multiple generations of DNA-methylation clocks. After adjustment for sex, BMI, hsCRP, and sCD163, semaglutide significantly decreased epigenetic aging: PCGrimAge (-3.1 years, P = 0.007), GrimAge V1 (-1.4 years, P = 0.02), GrimAge V2 (-2.3 years, P = 0.009), PhenoAge (-4.9 years, P = 0.004), and DunedinPACE (-0.09 units, ≈9 % slower pace, P = 0.01). Semaglutide also lowered the multi-omicOMICmAge clock (-2.2 years, P = 0.009) and the transposable element-focused RetroAge clock (-2.2 years, P = 0.030). Eleven organ-system clocks showed concordant decreased with semaglutide, most prominently inflammation, brain and heart, whereas an Intrinsic Capacity epigenetic clock was unchanged (P = 0.31). These findings provide, to our knowledge, the first clinical-trial evidence that semaglutide modulates validated epigenetic biomarkers of aging, justifying further evaluation of GLP-1 receptor agonists for health-span extension.

72 INTRODUCTION

73
74 Aging is the primary driver of chronic diseases, multimorbidity, and mortality worldwide,
75 positioning interventions targeting biological aging as transformative therapeutic strategies with
76 potential to substantially improve human healthspan(López-Otín et al. 2023; Kennedy et al.
77 2014). Within the emerging geroscience paradigm(Kennedy et al. 2014), pharmacologic agents
78 originally developed for metabolic indications, such as glucagon-like peptide-1 (GLP-1) receptor
79 agonists(Wilding et al. 2021; Davies et al. 2021; Marso et al. 2016; Maretty et al. 2025), have
80 garnered attention due to their potential dual roles in metabolic regulation and aging biology.
81 Semaglutide, a once-weekly glucagon-like peptide-1 (GLP-1) receptor agonist, has emerged as
82 a transformative therapeutic for its marked weight reduction and cardiometabolic benefits,
83 including reductions in visceral adipose tissue(Wilding et al. 2021; Davies et al. 2021; Marso et
84 al. 2016). Given that obesity and adiposity embed an obesogenic epigenetic memory and are
85 linked to accelerated epigenetic aging(de Toro-Martín et al. 2019; Lundgren et al. 2022; Hinte et
86 al. 2024), there is growing interest in whether semaglutide’s metabolic effects might slow or
87 reverse aspects of biological aging. Despite extensive evidence supporting semaglutide’s
88 pleiotropic benefits, randomized clinical trial data evaluating its effects on aging biomarkers
89 remain absent.

90 People with HIV (PWH) represent a unique population exhibiting accelerated biological
91 aging, characterized by premature onset of age-related conditions, persistent low-grade
92 inflammation, and metabolic dysfunction, even when HIV replication is effectively suppressed by
93 antiretroviral therapy (ART)(Deeks 2011; Breen et al. 2022; Pathai et al. 2014). A common
94 metabolic complication in this population is HIV-associated lipohypertrophy, defined by
95 excessive accumulation of visceral and ectopic adipose tissue, which further exacerbates aging

96 processes(Koethe et al. 2020). Within the geroscience framework(Montano et al. 2022), the
97 accelerated-aging phenotype in PWH provides an ideal clinical model to evaluate candidate
98 geroprotective therapies, with findings potentially relevant to the general aging population. This
99 setting may allow earlier insights into treatment effects, particularly via DNA-methylation based
100 epigenetic clocks and other emerging aging biomarkers, which are recently being considered as
101 outcome measures in double-blind, randomized geroscience trials(Kroemer et al. 2025) and
102 global competitions testing gerotherapeutics(Justice 2024).

103 In a completed phase 2b, randomised, double-blind, placebo-controlled trial, we tested
104 whether once-weekly semaglutide can slow epigenetic aging in people with HIV-associated
105 lipohypertrophy, a population marked by visceral adiposity and accelerated epigenetic age.
106 Using paired peripheral-blood methylomes collected at baseline and 32 weeks, we conducted a
107 post-hoc analysis spanning 17 first-, second-, and third-generation DNA-methylation clocks.
108 Here we test whether once-weekly semaglutide slows DNA-methylation aging in this high-risk
109 population. To our knowledge, this provides the first randomized clinical evidence that a licensed
110 GLP-1 receptor agonist modulates epigenetic biomarkers of aging, positioning semaglutide as
111 a candidate gerotherapeutic and laying the groundwork for prospectively powered, mechanism-
112 focused trials aimed at extending healthspan in populations vulnerable to accelerated aging.

113 114 **RESULTS**

115 116 **Posthoc Epigenetic Age Analysis of a Randomized Trial of Semaglutide**

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118 To determine whether semaglutide treatment could impact biological aging, we conducted
119 a post hoc epigenetic analysis of participants enrolled in a previously reported 32-week,
120 randomized, double-blind, placebo-controlled phase 2b clinical trial evaluating semaglutide in

121 people with HIV (PWH) and lipohypertrophy (Eckard et al. 2024)(**Figure 1**). The trial aimed to
122 evaluate the effects of the GLP-1 receptor agonist semaglutide on adipose tissue quantity and
123 distribution in individuals with HIV-associated lipohypertrophy over a 32-week period. Eligible
124 participants included adults aged 18 years or older with documented HIV-1 infection, stable ART
125 for at least 12 weeks, and controlled HIV-1 RNA levels (<400 copies per mL) for six months prior
126 to screening. Additional inclusion criteria were a BMI of 25 kg/m² or greater and the presence of
127 lipohypertrophy without type 1 or type 2 diabetes or cardiovascular disease. Participants were
128 randomly assigned 1:1 to receive either once-weekly subcutaneous semaglutide (8-week dose
129 titration followed by 24 weeks at 1.0 mg) or matching placebo. All weekly injections were
130 provided in the clinic by a certified nurse. Randomization was performed using an online
131 software program with block sizes of six, and treatment assignments were masked to
132 participants, investigators, and research personnel. Of 154 individuals assessed for eligibility,
133 108 were randomized (54 in each group). Eight participants (15%) from each group withdrew
134 prematurely. The study's primary outcomes included changes in adipose tissue quantity across
135 body compartments; abdominal visceral and subcutaneous adipose tissue were measured by
136 L4-L5 non contrast abdominal CT scan imaging, while total body fat, trunk and peripheral fat
137 were measured by whole body DEXA scan. Secondary outcomes included metabolic measures
138 (glucose metabolism, insulin resistance, lipid profiles), anthropometric changes (weight, BMI,
139 waist-to-hip ratio), inflammation and immune activation markers, and safety. The trial is
140 described in more detail at ClinicalTrials.gov (NCT04019197) and in Methods. Results for the
141 primary outcomes were published(Eckard et al. 2024). Peripheral blood mononuclear cells
142 (PBMCs) were collected at baseline and 32 weeks follow-up and biobanked.

143 We first quantified biological age using established first-(Horvath 2013; Hannum et al.
144 2013), second-(Levine et al. 2018; Lu et al. 2019), and third- generation epigenetic clocks(Belsky
145 et al. 2022; Ying et al. 2024) in biobanked longitudinal peripheral-blood mononuclear cells from
146 84 total participants (45 semaglutide, 39 placebo) using epigenetic DNA-methylation data
147 obtained at baseline and week 32. We also utilized versions of 1st and 2nd generation clocks built
148 from DNAm principal components (PCs) (termed ‘PC clocks’) that show enhanced technical
149 reliability and utility in longitudinal study designs such as randomized clinical trials(Higgins-Chen
150 et al. 2022).

151 For the epigenetic analysis, at baseline the 84 participants (45 semaglutide, 39 placebo)
152 were middle-aged, with a mean \pm SD age of 49 ± 12 years and well balanced between treatment
153 arms (48 ± 13 vs. 50 ± 12 years). 42% were women overall, but men were slightly
154 over-represented in the semaglutide group (67 % vs. 49 %). The cohort included 58 % Black,
155 38 % White and 11 % Hispanic participants with nearly identical distributions across groups.
156 Immunologically, CD4 counts were high (median $762 \text{ cells } \mu\text{L}^{-1}$) and CD4/CD8 ratios near 1.0,
157 reflecting immune reconstitution; nadir CD4 counts were lower, as expected, but similar between
158 arms. Viral suppression was durable: only 9 % had HIV-1 RNA above the lower limit of
159 quantification, and ART duration averaged ~ 14 years. Participants were obese (median BMI
160 32.9 kg m^{-2}) with comparable anthropometry in each group. One-third were current smokers,
161 another quarter former smokers. Glycemic control was normal (median HbA1c 5.5 %), although
162 insulin resistance was evident (median fasting HOMA-IR 2.9), again without meaningful group
163 differences. Estimated 10-year ASCVD risk was moderate at 4.7 % (IQR 2.2–8.0). Inflammatory
164 biomarkers showed low-grade activation: median high-sensitivity CRP $4.1 \mu\text{g/mL}$ and sCD163

165 605 pg mL⁻¹, with slightly higher values in placebo. Overall, baseline characteristics of
166 participants assayed in the epigenetic analysis were well matched. (**Table 1**).

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168 **Semaglutide Slows Epigenetic Aging Across Multiple DNA Methylation Clocks**

169 We evaluated the impact of semaglutide treatment on biological aging using 17 DNA
170 methylation (DNAm)-based epigenetic clocks spanning first-, second-, and third-generation
171 models. In ANCOVA models adjusting for baseline covariates (sex, BMI, hsCRP, and sCD163),
172 semaglutide was associated with significantly reduced epigenetic aging relative to placebo
173 across multiple clocks (**Figure 2A**). The most pronounced effects were observed for second-,
174 and third-generation epigenetic clocks. Specifically, for PCGrimAge (a mortality-risk DNAm age
175 estimate), semaglutide was associated with a 3.08-year lower annual epigenetic age increase
176 compared to placebo (ANCOVA adjusted difference = -3.08 years/year, 95% CI: -5.29 to -0.86,
177 $p = 0.007$). For DunedinPACE, semaglutide was associated with a 0.09 lower pace-of-aging
178 (units per year) relative to placebo (95% CI: -0.17 to -0.02, $p = 0.01$). These estimates translate
179 to roughly a 9% slower pace of aging and a 3-year reduction in annual biological age increase
180 in the semaglutide group compared to placebo. Semaglutide also significantly reduced biological
181 age acceleration in SystemsAge (-4.17 years/year, $p = 0.009$), PhenoAge (-4.90 years/year, p
182 = 0.004), PCPhenoAge (-3.68 years/year, $p = 0.02$), and OMICmAge (-2.20 years/year, $p =$
183 0.009) (Chen et al. 2023) a next-generation DNA-methylation clock derived by modelling an
184 electronic-medical-record-based aging phenotype with epigenetic, proteomic, metabolomic and
185 clinical biomarker proxies. RetroClock, an epigenetic clock designed to capture retrotransposon-
186 associated aging (Ndhlovu et al. 2024), also showed a significant response to semaglutide
187 treatment. In adjusted models, semaglutide was associated with a -2.18 year/year reduction in

188 RetroClock age compared to placebo (95% CI: -4.14 to -0.21 ; $p = 0.030$). In contrast to the
189 more robust effects observed across mortality- and systems-level clocks, AdaptAge, CausAge,
190 and DamAge (Ying et al. 2024) exhibited modest, directionally heterogeneous, and statistically
191 non-significant changes with semaglutide treatment. AdaptAge increased by 3.49 years (95%
192 CI: -2.20 to 9.18 ; $p = 0.23$), CausAge by 0.46 years (95% CI: -2.40 to 3.32 ; $p = 0.75$), and
193 DamAge decreased by -2.22 years (95% CI: -7.09 to 2.65 ; $p = 0.37$) compared to placebo,
194 highlighting the differential responsiveness of epigenetic aging clocks.

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196 **Intrinsic Capacity Clock Shows No Significant Change with Semaglutide Treatment**

197 A DNA methylation-based epigenetic clock of Intrinsic Capacity (IC) was recently
198 developed using elastic net regression in the INSPIRE-T cohort, identifying 91 CpG sites
199 predictive of IC scores derived from clinical assessments (Fuentealba et al. 2025). This IC
200 epigenetic clock showed strong age-related decline and only modest overlap with traditional
201 epigenetic clocks, suggesting it captures a distinct axis of biological aging linked to physical and
202 cognitive resilience. Hence, we evaluated the responsiveness of this first-generation Intrinsic
203 Capacity (IC) clock to semaglutide in our study. In ANCOVA models adjusting for baseline age,
204 sex, BMI, high-sensitivity CRP, and sCD163, semaglutide treatment did not significantly alter IC
205 clock estimates over the 32-week period (estimated group difference: 0.003 IC score; $p = 0.31$)
206 (**Figure 2B**). Caution is warranted in responsiveness of first-generation IC epigenetic clock
207 changes to semaglutide and warrants further study.

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209 **Semaglutide reduction in epigenetic age as measured by GrimAge and GrimAgeV2 using**
210 **Biolearn**

211 As an orthogonal computational approach to assess biological aging with second-
212 generation mortality-based epigenetic clocks, we used Biolearn, an open-source library for
213 biomarkers of aging, to examine whether semaglutide treatment significantly impacted DNA
214 methylation-based age estimates for GrimAge V1(Lu et al. 2019) and the updated GrimAge
215 V2(Ying et al. 2023; Lu et al. 2022). Using adjusted ANCOVA models controlling for BMI, high-
216 sensitivity C-reactive protein (HsCRP), soluble CD163, and sex, we found that randomization to
217 semaglutide was significantly associated with reductions in both GrimAge clocks. Participants
218 randomized to semaglutide exhibited a 1.39-year lower GrimAgeV1 estimate compared to
219 placebo (95% CI: -2.72 to -0.05 ; $p = 0.042$) over the 32-week trial. The effect was more
220 pronounced in GrimAgeV2, with a 2.26-year reduction relative to placebo (95% CI: -3.94 to $-$
221 0.59 ; $p = 0.008$). These findings, derived using the Biolearn modeling framework, provide
222 orthogonal confirmation that semaglutide may decelerate biological aging as captured by
223 mortality risk–associated epigenetic signatures.

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225 **Semaglutide Broadly Decelerates Multi-system Epigenetic Aging Across 11 System** 226 **Clocks**

227 Because GLP-1 receptor agonists like semaglutide have demonstrated pleiotropic
228 benefits that span cardiometabolic, renal, hepatic and neuroprotective domains(Zheng et al.
229 2024), we next evaluated whether these effects extended to organ-specific biological aging. We
230 applied a panel of 11 DNA methylation–based “system clocks” derived from a single blood
231 methylation assay that deconvolves biological aging across individual organ systems, including
232 blood, brain, inflammation, heart, hormone, immune, kidney, liver, metabolic, lung, and
233 musculoskeletal domains(Sehgal et al. 2023). Each system clock captures both all-cause

234 mortality risk and organ-specific decline; for example, the Heart clock predicts cardiovascular
235 events, while the Brain clock tracks cognitive function and neuroimaging correlates. In adjusted
236 ANCOVA models controlling for age, sex, BMI, hsCRP, and sCD163, semaglutide treatment
237 was associated with consistent reductions in epigenetic age across all 11 systems (**Figure 4**).
238 The largest effects were observed in the Blood (-4.37 years, $p = 0.011$), Brain (-4.99 years, $p =$
239 0.0049), and Inflammation (-5.01 years, $p = 0.0056$) clocks. Substantial deceleration was also
240 observed in the Heart (-4.34 years, $p = 0.0088$), Kidney (-4.20 years, $p = 0.014$), Liver (-4.19
241 years, $p = 0.042$), and Metabolic (-4.72 years, $p = 0.0090$) clocks. While trends were directionally
242 favorable, semaglutide-related reductions in epigenetic age did not reach statistical significance
243 for the Lung (-2.21 years; 95% CI: -5.19 to 0.76 ; $p = 0.14$), Hormone (-1.33 years; 95% CI: $-$
244 4.01 to 1.35 ; $p = 0.33$), Immune (-1.60 years; 95% CI: -4.83 to 1.64 ; $p = 0.33$), and
245 Musculoskeletal (-2.32 years; 95% CI: -5.45 to 0.81 ; $p = 0.15$) system clocks. These findings
246 highlight the potential of semaglutide to exert geroprotective effects that extend across multiple
247 physiological systems.

248

249 **Discussion**

250 This study provides, to our knowledge, the first randomized clinical trial evidence that
251 once-weekly semaglutide can modulate biological aging, as measured by DNA methylation-
252 based epigenetic clocks. Over the 32-week intervention period in individuals with HIV-associated
253 lipohypertrophy, a population characterized by metabolic dysfunction and accelerated biological
254 aging, semaglutide treatment led to robust attenuation and, in some cases, reversal of age-
255 related DNA methylation signatures. Notably, the most pronounced effects were observed in
256 second-generation clocks predictive of morbidity and mortality risk and in third-generation

257 measures of biological aging rate (DunedinPACE) suggesting that semaglutide may exert
258 pleiotropic effects that extend beyond metabolic regulation to influence biological aging.

259 Our results align well with emerging geroscience paradigms, which propose that lifestyle
260 and metabolic interventions capable of reducing adiposity, systemic inflammation, and insulin
261 resistance could significantly modulate aging trajectories and improve healthspan (Kennedy et
262 al. 2014). Notably, similar epigenetic clock signals have been observed with caloric restriction
263 (CALERIE trial; (Waziry et al. 2023)) and multimodal lifestyle interventions (DO-HEALTH trial;
264 (Bischoff-Ferrari et al. 2025)), supporting the broader concept that targeted metabolic
265 modulation can impact aging pathways. Given the considerable burden of multimorbidity and
266 mortality driven by age-related chronic conditions worldwide, identifying pharmacological agents
267 like semaglutide capable of slowing biological aging represents a critical advancement for
268 geroscience (Kroemer et al. 2025). Further longitudinal studies specifically examining the effects
269 of GLP-1 receptor agonists on validated biomarkers of aging are warranted to clarify their role
270 within the expanding geroscience therapeutic landscape.

271 Semaglutide's multi-organ impact (Marso et al. 2016; Wilding et al. 2021; Badve et al.
272 2025; Davies et al. 2021), observed consistently across system-specific epigenetic clocks,
273 further underscores its gerotherapeutic potential. Strong reductions in biological age within
274 inflammation, brain, cardiovascular, hepatic, and renal systems suggest pleiotropic
275 geroprotective mechanisms consistent with emerging literature indicating broad systemic
276 benefits of GLP-1 receptor agonists. Indeed, we observed previously that semaglutide treatment
277 markedly decreased inflammation-associated biomarkers (IL-6, sCD163) previously linked to
278 morbidity and mortality in HIV (Funderburg et al. 2025). These findings align with emerging
279 mechanistic studies in murine models showing that GLP-1R agonists can reverse obesogenic

280 memory through anti-inflammatory and metabolic reprogramming of adipose tissue, targeting
281 pathways such as CCL2/CCR2 that drive epigenetic and metabolic dysfunction(Léon et al.
282 2025). Recent proteomic studies have also revealed that semaglutide alters circulating proteins
283 involved in lipid metabolism, inflammation, and cardiovascular risk pathways—independent of
284 weight loss—suggesting broader reprogramming effects that could synergize with epigenetic
285 aging deceleration(Marett et al. 2025). These data suggest a plausible mechanistic link wherein
286 semaglutide mitigates chronic immune activation and inflammatory signaling pathways central
287 to aging acceleration, particularly relevant in populations experiencing chronic inflammation such
288 as PWH.

289 Our results provide insights into potential biological mechanisms underlying
290 semaglutide's geroprotective effects. Given that epigenetic age acceleration correlated more
291 closely with measures of central adiposity rather than systemic inflammation, semaglutide's
292 marked ability to reduce visceral adipose tissue may directly mitigate adipose-driven pro-aging
293 signals such as dysregulated adipokine secretion and local inflammation. Recent studies have
294 demonstrated that adipose tissue retains a persistent "obesogenic epigenetic memory,"
295 characterized by stable transcriptional and chromatin accessibility changes even after significant
296 weight loss, predisposing individuals to adverse metabolic responses upon weight regain(Hinte
297 et al. 2024). Improved adipose tissue function and enhanced insulin sensitivity achieved through
298 semaglutide treatment could thus disrupt or partially reverse these detrimental epigenetic
299 signatures. Further mechanistic investigations into adipocyte-specific methylation patterns,
300 chromatin remodeling, and transcriptional responses to semaglutide will be critical to confirm its
301 role in counteracting adipose-derived epigenetic memory and reducing susceptibility to
302 metabolic dysfunction and accelerated biological aging.

303 Our study also highlights important methodological insights regarding epigenetic clocks
304 as outcome measures(Conole et al. 2025; Teschendorff & Horvath 2025; Perri et al. 2025). We
305 observed heterogeneous responsiveness across different classes of epigenetic biomarkers.
306 While mortality-linked clocks, pace of aging, and multi-system indices demonstrated robust
307 treatment effects, clocks designed to capture resilience (AdaptAge, IC clock) or causally-driven
308 aging (CausAge, DamAge) were less responsive. This finding emphasizes the need for careful
309 biomarker selection in geroscience trials, acknowledging unique epigenetic clock-specific
310 attributes. Moreover, despite these promising findings, several limitations of our findings should
311 be considered. This study represents a post hoc analysis, limited by sample size and short
312 follow-up duration. Longer-term trials with larger cohorts are necessary to validate durability,
313 translate epigenetic changes into clinical outcomes, and assess generalizability beyond the
314 unique HIV-associated lipohypertrophy population. Additionally, exploring alternative GLP-1
315 agonists, dosing or treatment regimens (e.g., microdosing) could enhance applicability to
316 broader populations interested in preventive aging interventions.

317 To our knowledge, this study provides the first placebo-controlled randomized clinical trial
318 evidence that a GLP-1 receptor agonist can modulate DNA methylation-based biomarkers of
319 biological aging. These findings strongly support semaglutide's potential as a gerotherapeutic
320 capable of influencing fundamental aging processes. By demonstrating semaglutide's robust
321 impact across multiple validated epigenetic aging clocks, our results provide compelling rationale
322 for systematically evaluating GLP-1 receptor agonists through FDA-approved drug repurposing
323 frameworks, accelerating their clinical translation as geroscience-guided therapies to enhance
324 healthspan and prevent chronic age-related diseases.

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335 **Table 1: Baseline characteristics of the clinical trial population overall and by treatment**

336 **group**

Baseline Characteristic		All participants (N = 84)	Semaglutide (n=45)	Placebo (n=39)
Age (years)	Mean (SD)	49 (12.5)	48 (13.1)	50 (11.8)
Sex	Male	49 (58%)	30 (67%)	19 (49%)
	Female	35 (42%)	15 (33%)	20 (51%)
Race or ethnicity	Black	49 (58%)	26 (58%)	23 (59%)
	White	32 (38%)	18 (40%)	14 (36%)
	Biracial	2 (2%)	0	2 (5%)
	Native American	1 (1%)	1 (2%)	0
	Hispanic	9 (11%)	4 (9%)	5 (13%)
HIV Variables	CD4 T-cell count, cells per ul	762 (525, 1058)	830 (389.3, 1081)	728 (547, 923)
	CD8 T-cell count, cells per ul	806 (571, 1054)	762.5 (572, 1074)	847 (571, 1023)
	CD4/CD8 Ratio	0.98 (0.61, 1.43)	1.04 (0.51, 1.31)	0.97 (0.61, 1.43)
	Nadir CD4, cells per ul	211 (97, 377)	266 (105.5, 509)	163 (62.25, 313)
	HIV-1 RNA (copies/mL) >LLQ	8 (9%)	3 (7%)	5 (13%)
	HIV duration, months	228.8 (139.7, 312.6)	200 (113.4, 491.2)	235.8 (158.4, 301.7)
	Antiretroviral therapy duration, months	175.1 (107.5, 223.8)	184.6 (97.49, 223.2)	160.5 (109.9, 225.6)
Anthropometric Measurements	BMI, kg/m ²	32.86 (28.82, 38.97)	32.80 (28.61, 35.93)	33.09 (28.99, 39.73)
Lifestyle variables	Current Smoker	29 (35%)	13 (29%)	16 (41%)
	Past Smoker	21 (25%)	12 (27%)	9 (23%)
	Never Smoked	34 (40%)	20 (44%)	14 (36%)
Glucose Metabolism and Insulin Resistance	HbA1c %	5.5 (5.2, 5.8)	5.4 (5.1, 5.8)	5.6 (5.4, 5.9)
	Fasting HOMA-IR	2.9 (2.0, 5.1)	2.6 (1.4, 4.6)	3.7 (2.2, 7.5)
	2-h OGTT HOMA-IR	10.3 (5.1, 26.8)	9.9 (4.9, 19.1)	10.4 (5.1, 42.0)

Baseline Characteristic		All participants (N = 84)	Semaglutide (n=45)	Placebo (n=39)
Cardiovascular Disease Risk	10-year atherosclerotic cardiovascular disease risk estimate, %	4.7 (2.2, 8.0)	4.5 (2.4, 7.7)	4.8 (1.9, 8.8)
Plasma Biomarkers	Hs-CRP ($\mu\text{g/mL}$)	4.142 (2.021, 7.976)	3.785 (1.743, 6829)	5.713 (2.663, 9.668)
	ss (pg/L)	604.7 (456.4, 849.1)	591.9 (458.1, 752.8)	616.9 (446.9, 993.7)
	sCD14 (pg/L)	1785 (1505, 2122)	1683 (1398, 2085)	1927 (1650, 2130)

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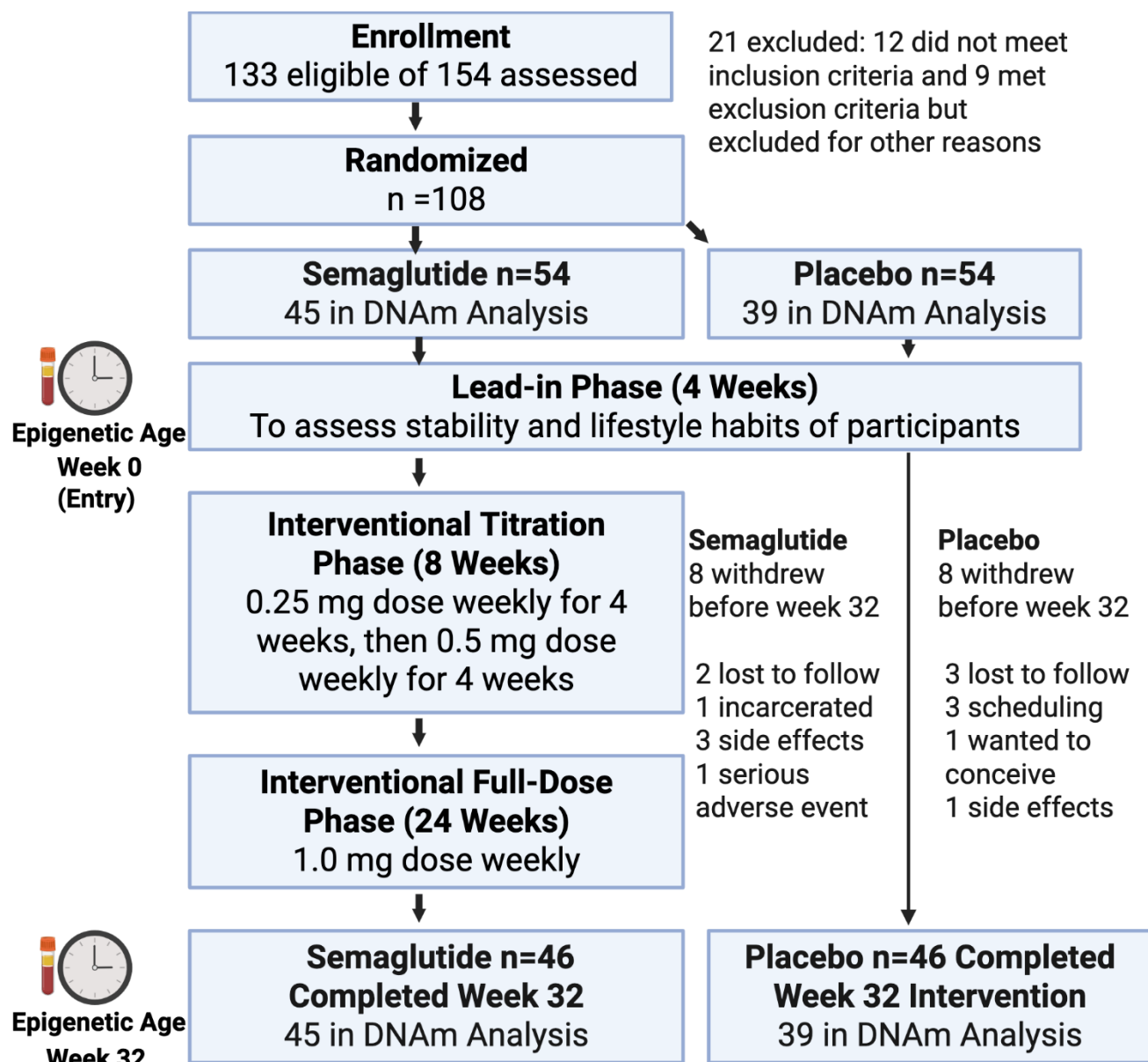
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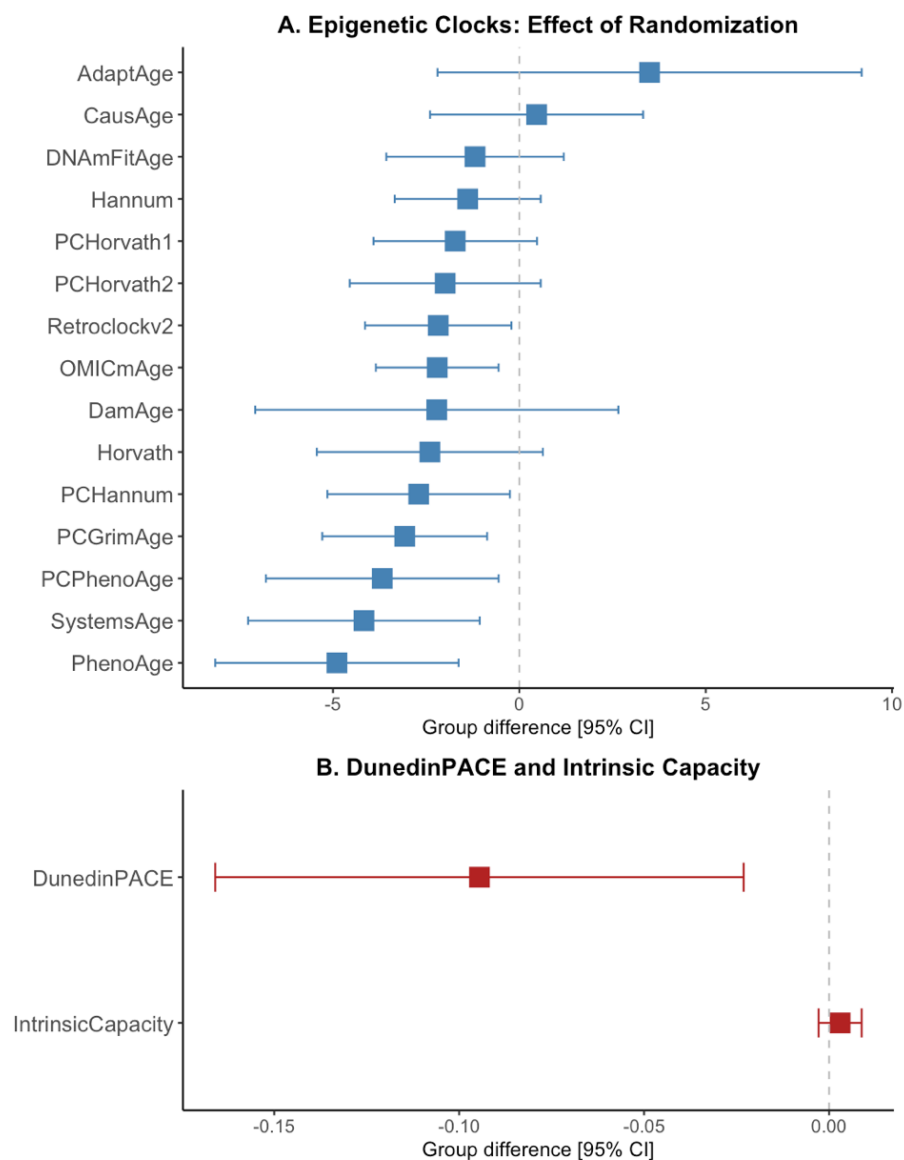
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Figure 1: Consort Diagram for the semaglutide trial in PWH. Epigenetic age was assayed from peripheral blood mononuclear cell samples collected at baseline (Week 0) and the post interventional phase follow up time point (Week 32). Of the total 92 participants that completed longitudinal Week 0 and week 32 assessments, epigenetic age was assayed longitudinally for n = 45 semaglutide and n = 39 placebo participants.



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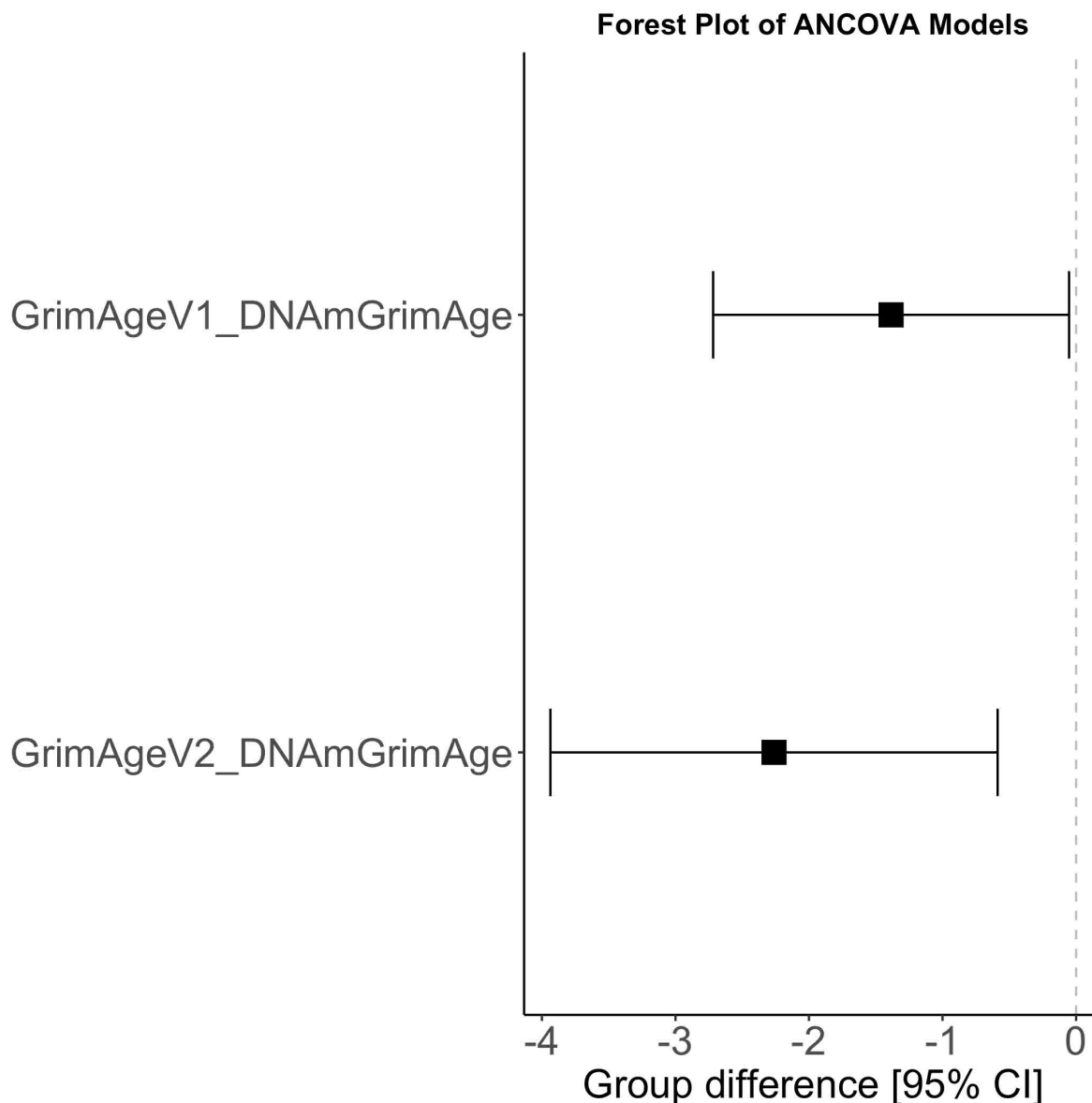


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Figure 2. Semaglutide broadly decelerates epigenetic aging across multiple methylation clocks.

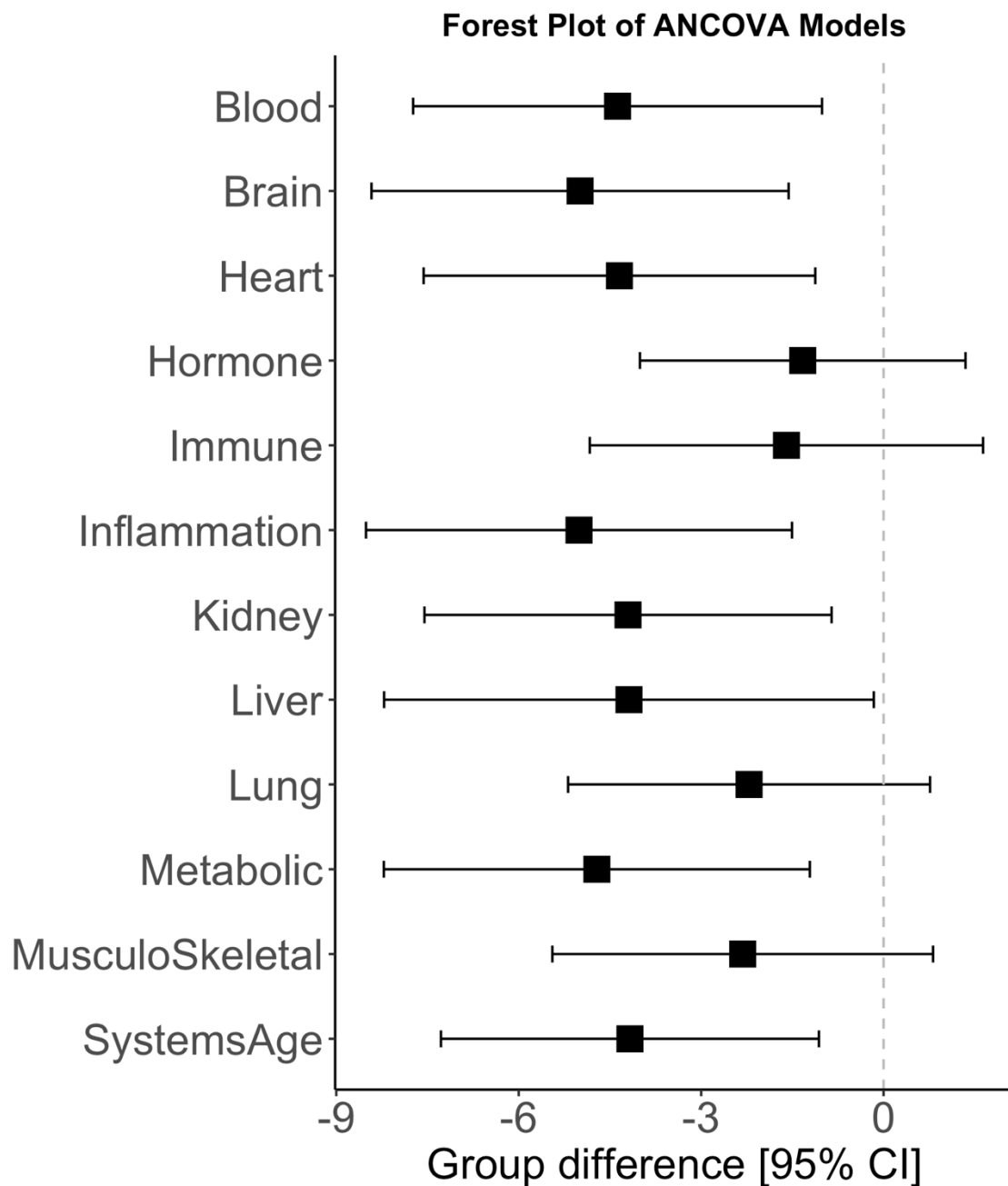
Forest plot displaying the estimated difference (semaglutide – placebo) in annualized epigenetic age change for DNA methylation–based biomarkers of aging. Estimates are derived from ANCOVA models adjusting for baseline age, sex, BMI, and inflammation (HsCRP and sCD163), with bars indicating 95% confidence intervals.

(A) Effects on 15 clocks spanning classical (Horvath, Hannum), principal component–based (PCHorvath1/2, PCHannum, PCPhenoAge), and newer modeling frameworks (PhenoAge, PCGrimAge, AdaptAge, CausAge, DamAge, DNAmFitAge, OMICmAge, Retroclockv2, SystemsAge). (B) DunedinPACE, a continuous pace-of-aging measure, and Intrinsic Capacity epigenetic clock. Negative estimates indicate slower biological aging in the semaglutide group. Semaglutide treatment was associated with a consistent deceleration across nearly all measures, highlighting its geroprotective potential.



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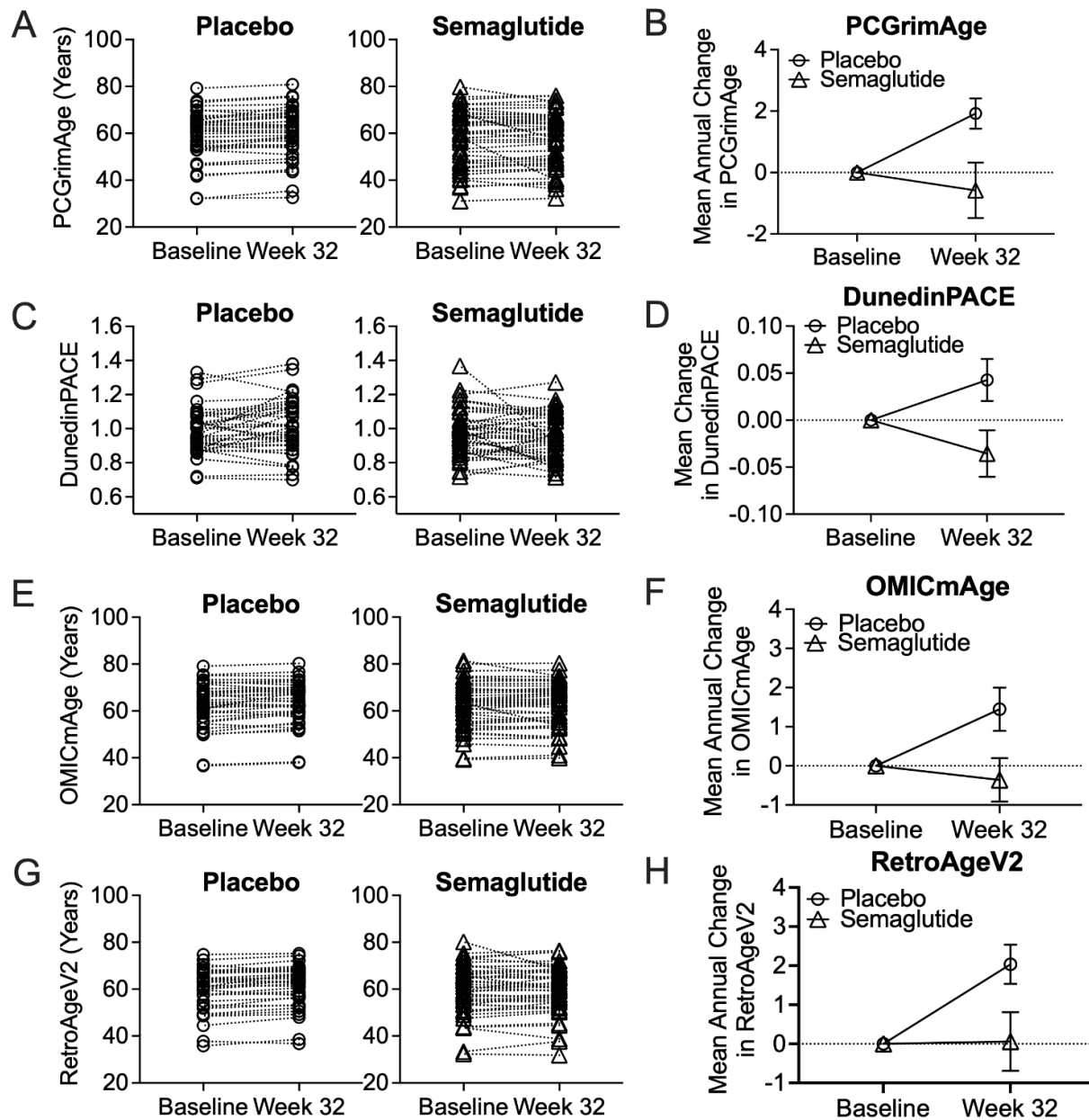
Figure 3. Forest plot showing the effect of semaglutide on GrimAge V1 and V2 epigenetic aging measures calculated from Biolearn. Adjusted ANCOVA models were used to assess the association between semaglutide treatment (Randomization) and DNA methylation-based aging estimates, GrimAgeV1_DNA and GrimAgeV2_DNA, while controlling for BMI, high-sensitivity C-reactive protein (HsCRP), soluble CD163, and sex. Estimates represent the mean difference in years between treatment and control groups, with 95% confidence intervals. Both GrimAgeV1 and GrimAgeV2 showed significant reductions in epigenetic age in the semaglutide group, with a stronger effect observed for GrimAgeV2 ($p = 0.0088$).



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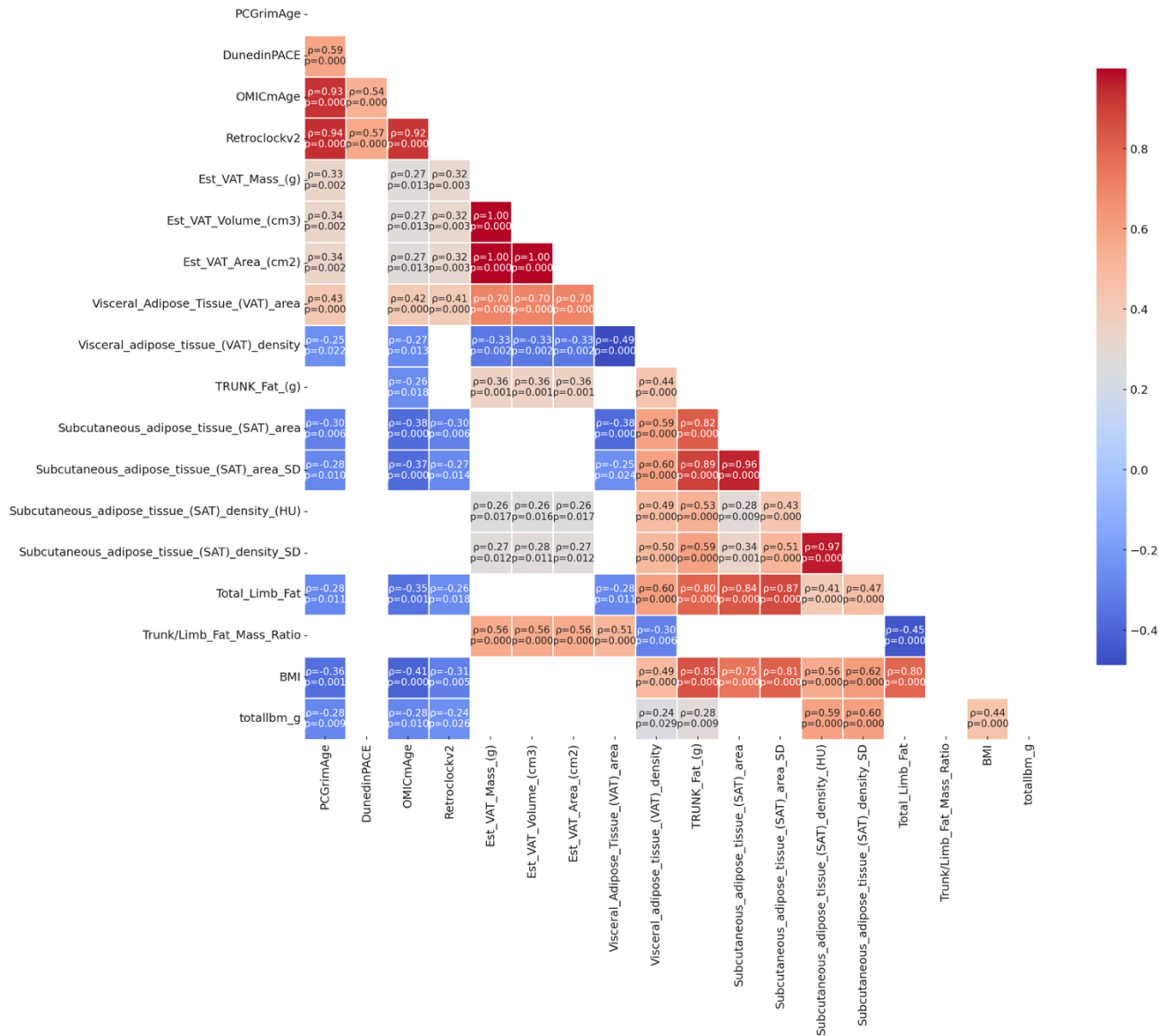
Figure 4. Semaglutide confers a multi-organ deceleration of system-level epigenetic aging.

Forest plot of the between-group difference (semaglutide – placebo) in annualized epigenetic age (years yr⁻¹) across 11 organ-system clocks (Blood, Brain, Heart, Hormone, Immune, Inflammation, Kidney, Liver, Lung, Metabolic, Musculoskeletal) plus a composite SystemsAge index. Data points represent adjusted mean differences (\pm 95% confidence intervals) estimated by ANCOVA, controlling for baseline age, sex, body-mass index, and inflammation. Negative values to the left of the dashed line indicate slower system-specific aging in the semaglutide group, with the largest effects seen in Blood, Brain, and Inflammation (\sim -6 years). The SystemsAge aggregate measure was \sim -4 years, underscoring a broad, multi-organ geroprotective signal.



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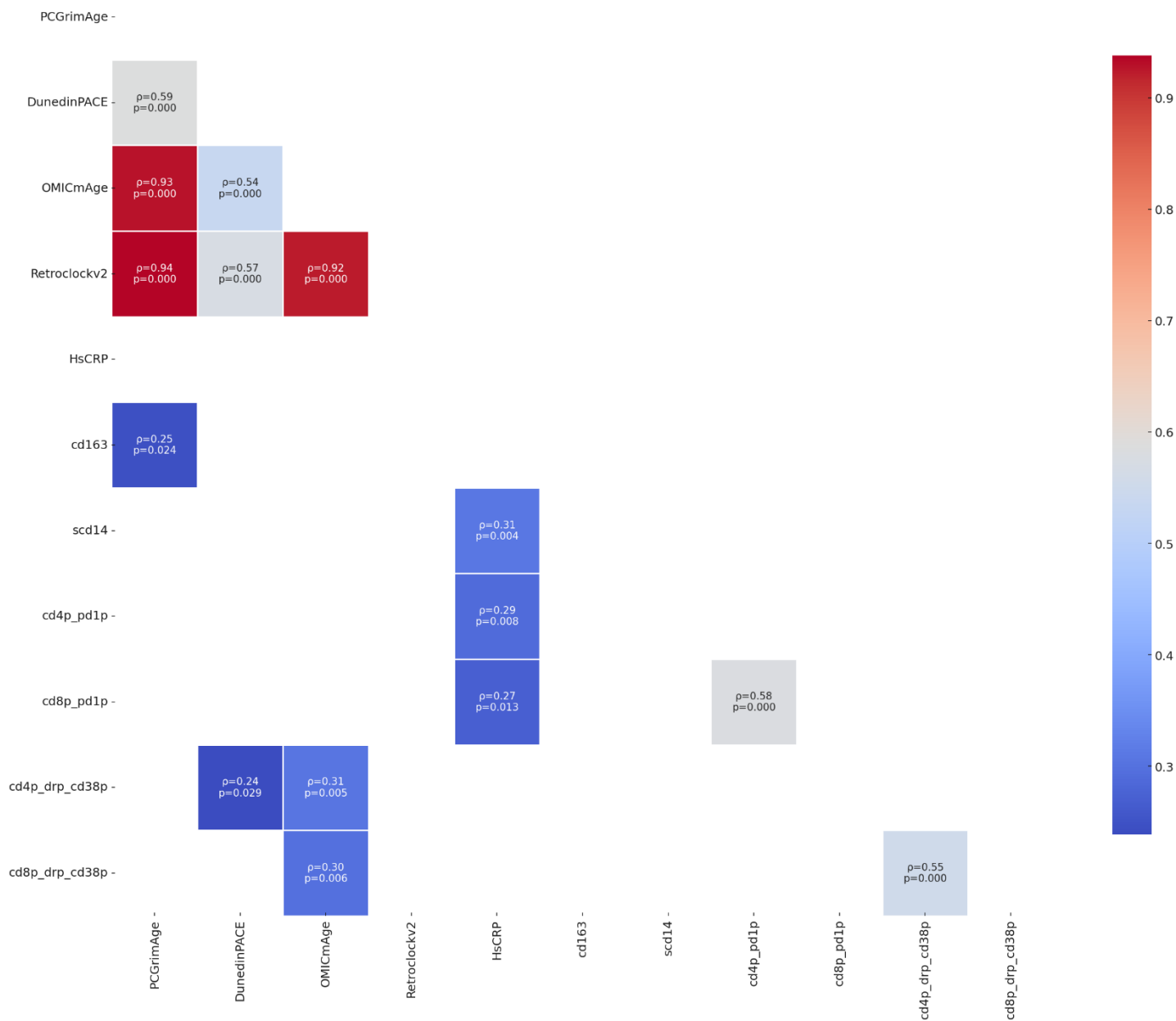
Supplemental Figure 1: Change in epigenetic age from baseline to week 32 follow-up in the placebo and semaglutide groups. Figure shows semaglutide treatment effects on two well established epigenetic clock algorithms previously utilized to evaluate clinical trials effects on biological aging, PCGrimAge and DunedinPACE. The new epigenetic clocks OMICmAge and RetroAgeV2 are also presented. Calculated values are displayed in open circles for each participant in the placebo (n=39) and open triangles for semaglutide (n=45) group. Values for PCGrimAge, OMICmAge, and RetroAgeV2 are in years and DunedinPACE are in pace-of-aging units where the reference norm is 1.0. The right column shows the mean annual change from baseline.



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Supplemental Figure 2: Epigenetic Age and Adiposity

Spearman correlation plot illustrating associations between epigenetic aging biomarkers and comprehensive adiposity phenotypes at baseline. Epigenetic aging measures include PCGrimAge, DunedinPACE, OMICmAge, and Retroclockv2. Adiposity was comprehensively assessed using visceral adipose tissue (VAT) measures (estimated mass, volume, area, and density), trunk fat, subcutaneous adipose tissue (SAT) characteristics (area, area standard deviation, density, density standard deviation), total limb fat, trunk-to-limb fat mass ratio, body mass index (BMI), and total body lean mass (totallbm_g). Spearman rho values are shown in colored boxes, with red indicating positive correlations and blue indicating negative correlations. Statistical significance (p-values) is indicated numerically within each cell, with significant correlations ($p < 0.05$) highlighted by the intensity of color shading. Non-significant associations are shown white boxes.



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Supplemental Figure 3: Epigenetic Age and Immune Biomarkers

The plot displays pairwise Spearman correlations (ρ) between epigenetic aging biomarkers (PCGrimAge, DunedinPACE, OMICmAge, Retroclockv2) and plasma inflammatory markers (HsCRP, CD163, sCD14) as well as flow cytometry-quantified T-cell subsets (PD-1⁺ CD4⁺ and CD8⁺ T cells, CD4⁺DR⁺CD38⁺, and CD8⁺DR⁺CD38⁺). Only statistically significant correlations ($p < 0.05$) are shown. Each annotated cell includes the correlation coefficient (ρ) and corresponding p -value. Strongest associations were observed between OMICmAge and both CD4⁺DR⁺CD38⁺ and CD8⁺DR⁺CD38⁺ T-cell subsets. Gray cells indicate non-significant correlations ($p \geq 0.05$).

430 **Materials and Methods**

431 **Study Design and Participants:** The Once-Weekly Semaglutide in People with HIV-Associated
432 Lipohypertrophy study was a single-center, randomized, double-blind, placebo-controlled phase
433 2b trial (ClinicalTrials.gov NCT04019197) conducted at University Hospitals Cleveland Medical
434 Center (Cleveland, OH). The primary trial objective was to evaluate semaglutide's effects on
435 body fat distribution in PLWH over 32 weeks. Key inclusion criteria were: age ≥ 18 years,
436 documented HIV-1 infection on stable ART for ≥ 12 weeks, HIV-1 RNA < 400 copies/mL for ≥ 6
437 months, body mass index (BMI) ≥ 25 kg/m², and clinical evidence of lipohypertrophy (central fat
438 accumulation) with waist circumference > 95 cm (men) or > 94 cm (women) and waist-to-hip ratio
439 > 0.94 (men) or > 0.88 (women). Participants with diabetes or active cardiovascular disease were
440 excluded, as were those pregnant or with uncontrolled comorbidities. A total of 154 individuals
441 were screened, 108 were randomized (54 to each group). Eight participants (15%) in each arm
442 discontinued prematurely, leaving 92 who completed 32 weeks; of these, 84 had paired samples
443 available for epigenetic analysis. Randomization was 1:1 to semaglutide or placebo, stratified by
444 sex, using block sizes of six via an online randomization system. Both participants and
445 investigators were blinded to treatment assignment. Semaglutide was administered by
446 experienced clinic nurses subcutaneously once weekly, with dose escalation (0.25 mg for 4
447 weeks, to 0.5 mg for 4 weeks, then to 1.0 mg) then 1.0 mg weekly through week 32. The placebo
448 group received volume-matched saline injections on the same schedule. The trial protocol was
449 approved by the Institutional Review Board, and all participants provided written informed
450 consent.

451 **Outcomes and Assessments:** While the parent trial's primary outcomes were changes in
452 adipose tissue volume (measured by CT) and body composition (DXA scans) at 32 weeks, our
453 current analysis focuses on epigenetic aging markers as secondary/exploratory outcomes.

454 Peripheral blood mononuclear cells (PBMCs) were collected by phlebotomy at baseline and
455 week 32 visits, isolated by Ficoll gradient, and cryopreserved at -80°C until analysis. Genomic
456 DNA was extracted from thawed PBMC samples using Qiagen kits. Genome-wide DNA
457 methylation profiling was performed using the Infinium MethylationEPICV2 BeadChip (Illumina),
458 which covers $>850,000$ CpG sites, following manufacturer protocols. Briefly, 500 ng of genomic
459 DNA per sample was bisulfite-converted (Zymo EZ DNA Methylation kit) and hybridized to the
460 EPIC array, with arrays scanned on an iScan instrument to produce raw intensity data. To pre-
461 process the methylation data, we used the *minfi* pipeline(Aryee et al. 2014), and low quality
462 samples were identified using the *qcfilter()* function from the ENmix package(Xu et al. 2016),
463 using default parameters. 100% of the original samples passed the QA/QC ($p < 0.05$) and were
464 deemed to be high quality samples.

465 **Epigenetic Clock Calculations:** We examined three generations of epigenetic clocks: first-
466 generation clocks that estimate chronological age (Horvath1, Horvath2, and Hannum clocks);
467 second-generation clocks that predict mortality/morbidity risk (PhenoAge and GrimAge,
468 including a principal-component version of GrimAge denoted PCGrimAge); and a third-
469 generation clock known as DunedinPACE, which measures the pace of aging (years aged per
470 chronological year). To improve robustness for longitudinal analysis, we used principal
471 component-based versions of the first- and second-generation clocks (denoted “PC clocks”)
472 wherever applicable. These PC clocks leverage principal components of DNAm data associated
473 with the original clock algorithms, enhancing technical reliability and reducing noise in repeated
474 measures. Published epigenetic clocks were calculated according to published methods from
475 processed DNA methylation data. To calculate the principal component-based epigenetic clock
476 for the Horvath multi-tissue clock, Hannum clock, DNAmPhenoAge clock, GrimAge clock, and

477 telomere length we used the custom R script available via GitHub
478 (<https://github.com/MorganLevineLab/PC-Clocks>). Non-principal component-based (non-PC)
479 Horvath, Hannum, and DNAmPhenoAge epigenetic metrics were calculated using the *methyAge*
480 function in the ENMix R package. The pace of aging clock, DunedinPACE, was calculated using
481 the *PACEProjector* function from the DunedinPACE package available via GitHub
482 (<https://github.com/danbelsky/DunedinPACE>). We used a 12 cell immune deconvolution method
483 to estimate cell type proportions (Zheng et al. 2018). For Biolearn, DNA methylation beta values
484 (ssNoob-normalized) and matched sample metadata were imported into R (v4.3.2). Python
485 integration was managed via the reticulate package, linking to a virtual environment with
486 BioLearn installed. Missing CpGs were imputed using dataset-wide means
487 via `impute_from_average()`, and the resulting matrix was combined with metadata into
488 a `GeoDataobject`. The GrimAgeV1 and GrimAgeV2 models, obtained from the
489 BioLearn ModelGallery, were applied using default parameters. Both models are based on Cox
490 proportional hazards regression, trained to predict time-to-death from DNA methylation profiles.
491 Internally, the models first extract a subset of CpGs relevant to DNAm surrogates for plasma
492 proteins and smoking pack-years, followed by transformation through weighted linear
493 combinations. These component predictors are then integrated into a multivariate Cox-PH model
494 to estimate mortality risk, which is scaled to generate biological age equivalents.

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496 **Statistical Analysis:** We computed the annual rate of epigenetic age change for each
497 participant on each clock as: $(\text{AgeWeek32} - \text{AgeBaseline}) / (32 \text{ weeks} / 52 \text{ weeks})$, yielding a “years
498 per year” change. For DunedinPACE, which is already a per-year rate, we computed the change
499 between Week32 and baseline values (so a negative change indicates slowing of aging). Group

500 comparisons of these rates were first assessed with Student's t-tests (two-sided) for an initial
501 view. The primary analysis used ANCOVA to estimate the effect of treatment (semaglutide vs.
502 placebo) on epigenetic aging rate, adjusting for prespecified covariates. Our model for each
503 aging measure included the baseline value of that measure (to adjust for regression to the
504 mean), treatment group, age, sex, baseline BMI, baseline HsCRP, and baseline sCD163. We
505 also ran alternative models replacing BMI with visceral fat mass, or HsCRP with IL-6 or sCD14,
506 with consistent results (data not shown). Interaction terms between treatment and key baseline
507 factors (e.g., baseline epigenetic age acceleration or baseline BMI) were explored to see if the
508 treatment effect varied by these factors. Because the study is exploratory for epigenetic
509 outcomes, we did not adjust p-values for multiple comparisons across the different clocks;
510 instead, we focus on consistency of the pattern of results. All analyses were conducted in R
511 (v4.2.2).

512 **Data Availability:** The epigenetic data generated (DNAm beta values for EPIC arrays) and
513 analyzed during this study will be made available in a public repository upon publication, with
514 controlled access to protect participant privacy. Summary data for epigenetic clock measures
515 and relevant clinical variables are provided in the Supplementary Information. The trial's
516 clinical data are available from the corresponding author on reasonable request, in accordance
517 with institutional data sharing policies. Anonymized data will be shared by request from a
518 qualified academic investigator for the sole purpose of replicating procedures and results
519 presented in the article.

520

521 **Code Availability:** Epigenetic clock algorithms were applied using publicly available code or R
522 packages as referenced above.

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701 **Author contributions:**

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Conceptualization: MJC and GM

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Methodology: MJC

704

Investigation: GAM, DL

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