1 Disentangling the relationship between biological age and frailty in 2 community-dwelling older Mexican adults

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24 **<u>Running headline:</u>** Frailty and biological age in community-dwelling older adults

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35 ABSTRACT (197/200 WORDS)

OBJECTIVE: Older adults have heterogeneous aging rates. Here, we explored the impact 36 37 of biological age (BA) and accelerated aging on frailty in community-dwelling older adults. 38 **METHODS:** We assessed 735 community-dwelling older adults from the Covocan Cohort. BA was measured using AnthropoAge, accelerated aging with AnthropoAgeAccel, and 39 40 frailty using both Fried's phenotype and the frailty index. We explored the association of 41 BA and accelerated aging (AnthropoAgeAccel ≥0) with frailty at baseline and characterized 42 the impact of both on body composition and physical function. We also explored accelerated aging as a risk factor for frailty progression after 3-years of follow-up. 43 **RESULTS:** Older adults with accelerated aging have higher frailty prevalence and indices, 44 45 lower handgrip strength and gait speed. AnthropoAgeAccel was associated with higher 46 frailty indices (β =0.0053, 95%CI 0.0027-0.0079), and increased odds of frailty at baseline (OR 1.16, 95%CI 1.09-1.25). We observed a sexual dimorphism in body composition and 47 physical function linked to accelerated aging in non-frail participants; however, this 48 dimorphism was absent in pre-frail/frail participants. Accelerated aging at baseline was 49 associated with higher risk of frailty progression over time (OR 1.74, 95%CI 1.11-2.75). 50 51 **CONCLUSIONS:** Despite being intertwined, biological accelerated aging is largely 52 independent of frailty in community-dwelling older adults.

53 **Keywords:** Biological age, frailty, frailty index, older adults, Mexico.

54

55 **INTRODUCTION**

Despite recent advances in the understanding of human aging across the lifespan, its 56 study in older adults remains challenging^{1,2}. Differences in the rates of biological aging in 57 58 older adults with similar chronological age (CA) have been characterized using methodologies that capture age-related changes in physical function, independence, and 59 resilience with greater nuance compared to CA³. Specifically, older adults present 60 heterogeneous aging profiles, ranging from modest physiological changes to significant 61 impairments in physical function, disability and dependence; entities that may be 62 influenced by underlying comorbidities and biological mechanisms independent of CA⁴⁻⁶. 63 Amongst available approaches to capture aging are the concepts of biological age (BA) 64 65 and frailty, which are often treated interchangeably and have been proposed to share common pathways^{7,8}. 66

Recent data has shown that BA changes in otherwise healthy midlife adults are associated 67 with progressive accumulation of deficits, multimorbidity and frailty^{9,10}. Data on the 68 69 influence of BA on frailty phenotypes in older adults are scarce; however, evidence in 70 centenarians suggests that such markers are useful to model aging even at extreme ages^{11,12}. Recently, we developed AnthropoAge as a proxy of BA that captures 71 multimorbidity and body composition changes associated with risk of 10-year mortality¹³. 72 73 However, the application of AnthropoAge in older adults has not been reported, nor its association with frailty phenotypes. Here, we analyzed data from community-dwelling older 74 75 adults in Mexico City to validate the use of AnthropoAge in older adults, aiming to characterize: 1) The extent to which accelerated biological aging intersects with frailty, 2) 76 77 the impact of frailty on the body composition and functional phenotype of accelerated 78 aging in older adults, and 3) the relevance of accelerated aging as a risk factor for progression to frailty. 79

80 METHODS

81 Study design and participants

82 We analyzed data from participants enrolled in the Coyoacán Cohort Study, a prospective 83 population-based cohort of randomly selected community-dwelling adults ≥70 years from the municipality of Coyoacán in Mexico City. Complete study details are published 84 elsewhere¹⁴. Briefly, baseline data collection was conducted from March 2008 until July 85 2009 in a two-stage process: first, participants were interviewed for sociodemographic and 86 87 health-related information using standardized guestionnaires, followed by medical and anthropometric examinations conducted by trained health personnel. A follow-up 88 evaluation was conducted in 2011, whereby questionnaires were repeated, and vital status 89 90 was ascertained by verbal autopsy of proxy relatives. Data collection protocols and study 91 procedures were approved by the Ethics Committee of the Instituto Nacional de Ciencias 92 Médicas y Nutrición Salvador Zubirán. For this sub-analysis, we included participants with 93 complete anthropometric measurements and data to evaluate two frailty measures.

94 Anthropometry and physical function measures

Standing height and weight were measured using Seca-214 stadiometers and Seca-803 95 scales. Mid-upper-arm, waist, hip, and calf circumferences were measured in centimeters 96 97 using non-stretch fiberglass measuring tape on the left side of the body with participants 98 standing. Maximal voluntary handgrip strength of the non-dominant hand was measured in kilograms with participants standing using a Baseline[™] Smedley spring-type hand 99 dynamometer. Body-mass index (BMI) was obtained by dividing weight in kilograms by the 100 101 square of height in meters, the waist-to-height ratio (WHtR) by dividing waist by height in 102 centimeters and the waist-to-hip ratio (WHR) by dividing waist by hip circumference in 103 centimeters. Physical performance was assessed with gait speed calculated from the 4 m walk included in the Short Physical Performance Battery test¹⁵, and with the Timed Up & 104

Go test, which measures the time in seconds as the participant rises from a chair without support, walks 3 meters, turns, walks back, and sits down again¹⁶. Grip strength, gait speed and Timed Up & Go data were only available for a subsample of n=283, n=267, and n=232 participants who underwent full medical evaluation, respectively. Estimates of all anthropometry measures are the average of at least two non-consecutive measurements¹⁴.

111 AnthropoAge estimation as a proxy of biological age

AnthropoAge uses CA and anthropometric measures to predict sex-specific 10-year mortality risk as a proxy of BA¹³. For this analysis, we implemented the simplified version of AnthropoAge using the *AnthropoAgeR* package¹⁷, which uses CA in years, BMI, and WHtR at baseline. To estimate BA acceleration, we calculated AnthropoAgeAccel using residuals from a linear model regressing AnthropoAge onto CA^{13,18}. Accelerated aging was defined as AnthropoAgeAccel \geq 0 years.

118 Frailty measures

Frailty is a multidimensional phenomenon, which encompasses both deficit accumulation and phenotypic changes. Because of its complexity, frailty has been operationalized using different approaches¹⁹. To increase generalizability of our findings, we implemented two distinct frailty measures:

123 1) **Modified frailty phenotype:** We used a modified definition of the frailty phenotype 124 proposed by Fried et al. previously validated for this population^{20,21}, which uses 125 data from interview questionnaires to identify: a) Unintentional weight loss $\geq 5 \square$ kg in 126 the last 12 \square months, b) Exhaustion, c) Low physical activity, d) Slowness, and e) 127 Weakness. As previously reported, participants were categorized as frail if they 128 fulfilled ≥ 3 criteria, pre-frail with 1–2 criteria, and non-frail with no criteria²².

129 2) Frailty index: We calculated the frailty index using Searle's procedure which 130 considers data from 42 deficits covering symptoms, signs, disabilities, and 131 diseases^{23–25}. Deficits considered are coded as binary variables and include: 132 breathing difficulties, myocardial infarction, stroke, hypertension, cancer, diabetes, dyslipidemia, thyroid disease, fractures, arthritis, urinary incontinence, eyesight 133 134 difficulties, hearing difficulties, falls, pain, smoking, difficulties from: pushing heavy 135 objects, lifting a coin, being seated, standing up from a chair, preparing a meal, 136 bathing, dressing, toileting, getting in and out from bed, moving around the house, 137 eating, shopping, medication intake and making finances; restless sleep, happiness, loneliness, sadness, low energy, depressed, feeling everything is an 138 139 effort, self-rated health, self-rated health compared a year ago and recent 140 hospitalization. All deficits are then added and divided by the overall number of 141 deficits resulting in a quotient which follows a gamma distribution, ranging from zero to one, with higher values representing higher frailty severity²⁵. 142

143 <u>Statistical analyses</u>

Categorical variables are reported as counts and frequencies, and continuous variables are reported as medians with interquartile ranges. Comparisons across categorical variables were conducted using Chi-squared or Fisher's hypergeometric tests, while Wilcoxon signed rank tests were conducted for continuous variables. All analyses were conducted using R version 4.3.3 and a p-value<0.05 defined statistical significance.

149 Association between frailty scores and AnthropoAge

To explore the association between the frailty index and the number of frailty components in the frailty phenotype (coded as 0, 1, 2 or \geq 3) with AnthropoAge and AnthropoAgeAccel at baseline, we used the Spearman correlation coefficient (ρ). We explored the association of frailty indices with AnthropoAgeAccel at baseline using multivariable linear regression,

adjusted for CA, sex, and number of comorbidities; additionally, the association between AnthropoAgeAccel and frailty categories (non-frail, pre-frail, and frail) was evaluated using ordinal logistic regression to estimate odds ratios (OR) of having more severe frailty categories, adjusted for CA, sex, and number of comorbidities at baseline. Next, we compared available anthropometric and physical performance measures in participants with and without accelerated aging (AnthropoAgeAccel values ≥ 0 vs. < 0) stratified by sex to investigate the influence of non-frailty versus pre-frailty/frailty on aging phenotypes¹³.

161 Accelerated aging as a risk factor for frailty progression

We explored transitions across frailty phenotypes at baseline until the 3-year follow-up stratified by the presence of accelerated aging. To explore the influence of accelerated aging at baseline with these transitions, we fitted a mixed effects ordinal logistic regression using the *ordinal* R package to estimate ORs for transitions across frailty categories over time. Models were adjusted for sex, CA, and number of comorbidities at baseline.

167 **RESULTS**

168 <u>Study population</u>

From 1,124 participants recruited at baseline, we included 735 participants with complete 169 170 anthropometric and frailty assessments. Amongst them, 389 (53%) were women, the median CA was 76 years (IQR 73-81), and 335 participants had accelerated aging 171 172 (45.6%). Compared to those without, participants with accelerated aging had similar CA, but higher prevalence of frailty, higher frailty index, BMI and WHtR, and higher prevalence 173 174 of diabetes (Table 1). Participants with accelerated aging also had lower handgrip strength 175 and gait speed. We observed a strong correlation between AnthropoAge and CA (ρ =0.93, 176 95%CI 0.92, 0.94), without significant differences by sex (p=0.515, Figure 1). After followup, status of 586/735 (79.7%) participants were known, amongst whom 61 had died (10%) 177 178 without differences in those with accelerated aging (Table 1).

179 <u>Biological age acceleration and frailty scores</u>

We observed an association between AnthropoAgeAccel and the frailty index (ρ =0.12, 180 95%CI 0.05-0.19), and between AnthropoAgeAccel and the number of components in the 181 frailty phenotype ($\rho=0.17$, 95%CI 0.10-0.24, **Figure 2**). We also identified an increase in 182 183 the frailty index (β =0.0053, 95%CI 0.0027-0.0079) for every 1-year increase in BA 184 acceleration as measured by AnthropoAgeAccel (Figure 3A). Additionally, individuals with accelerated aging had higher frailty indices, and we observed an increase in 185 186 AnthropoAgeAccel with higher number of components of the Fried Frailty Scale, 187 irrespective of sex (Figures 3B-C). AnthropoAgeAccel values were also higher in 188 individuals who presented individual frailty phenotype components, except for unintentional weight loss (Figures 3D-H). 189

190 *Frailty phenotype and accelerated biological aging*

191 Compared to non-frail, frail older adults had an adjusted AnthropoAgeAccel 1.71 years 192 higher (95%Cl 1.16, 2.25), without significant differences between pre-frail and frail older 193 adults (β = -0.25 years 95%Cl -0.10, 0.60). We estimate that a 1-year increase in 194 AnthropoAgeAccel was associated with ~16% higher odds (OR 1.16, 95%Cl 1.09-1.25), 195 and AnthropoAgeAccel ≥0 with ~74% higher odds of having a more severe frailty 196 phenotype (OR 1.74, 95%Cl 1.31-2.32) at baseline.

197 <u>Phenotypes of accelerated biological aging and frailty</u>

At baseline 145/366 (39.6%) non-frail older adults had accelerated aging, and this increased to 133/284 (46.8%) for pre-frail and to 57/85 (67.1%) for frail older adults (**Figure 4A**). When exploring the combined influence of frailty and accelerated aging we observed that in non-frail female participants, those with accelerated aging displayed higher BMI, WHtR, and WHR, they also presented higher arm circumference despite having lower handgrip strength and gait speed, indicating increased adiposity and lower

204 physical function (Figure 4B). Conversely, for non-frail male participants, those with accelerated aging had higher WHtR, WHR, similar BMI values and lower calf and arm 205 206 circumference, along with lower handgrip strength and gait speed, indicating a phenotype 207 of abdominal adiposity, decreased appendicular lean mass, and decreased physical function (Figure 4C). Amongst frail and pre-frail participants this sexual dimorphism was 208 209 absent, and participants with pre-frailty/frailty and accelerated aging all displayed body measures characterized by increased abdominal adiposity, decreased appendicular lean 210 211 mass, and impaired physical function, irrespective of sex (Figures 4D-E).

212 Influence of accelerated aging on progression to frailty

213 We analyzed 256 participants with complete 3-year follow-up. Amongst them 134 were 214 non-frail (52.3%), 96 were pre-fail (37.5%), and 26 were frail (10.2%). Amongst non-frail 215 participants 63/134 had accelerated aging at baseline (47.0%), which was lower compared 216 to 47/96 pre-frail (49.0%), and 17/26 frail participants (65.4%, Figure 5A). We observed a 217 significant number of transitions across frailty categories over time: participants with frailty 218 increased to 42 (162% increase), pre-frail participants increased to 136 (142% increase), and non-frail participants decreased to 78 (42% decrease, Figure 5B-C). A 1-year 219 220 increase in AnthropoAgeAccel values at baseline predicted ~19% higher odds of 221 progression from non-frailty to pre-frailty and pre-frailty to frailty at subsequent follow-ups 222 (OR 1.19, 95%CI 1.08-1.31); similarly, participants with accelerated aging at baseline (AnthropoAgeAccel ≥0 years), displayed ~74% higher adjusted odds of progression to 223 more severe frailty phenotypes at follow-up (OR 1.74, 95%CI 1.11-2.75). 224

225 **DISCUSSION**

In this sample of community-dwelling older adults from the Coyoacán Cohort, we characterized accelerated aging as a distinct entity from frailty. Older adults with accelerated aging have higher prevalence of pre-frailty and frailty, as well as lower

229 handgrip strength and gait speed, likely indicative of lower physical function. We also 230 found that older pre-frail or frail adults with accelerated aging had a phenotype indicative of 231 accumulation of visceral adiposity, decreased appendicular lean mass, and decreased physical function, irrespective of sex. This finding is in contrast to our previous study¹³. 232 233 which showed that accelerated aging displayed a sexual dimorphism in body composition, 234 a finding that we were able to replicate only in non-frail older adults. Finally, we also showed that AnthropoAgeAccel and accelerated aging phenotypes at baseline increased 235 the risk of transitioning over time from non-frail/pre-frail to pre-frail/frail phenotypes, 236 237 suggesting that BA acceleration is an independent risk factor for frailty progression. Overall, our data suggests that frailty and accelerated BA are intersecting but likely 238 239 separate phenomena in older adults and that their assessment should be explored separately to better ascertain biologically meaningful aging mechanisms^{26,27}. 240

The distinction between biological aging and frailty has been subject to controversv^{2,28,29}. 241 242 Frailty has been viewed as both a clinical syndrome comprised of low grip strength, slow gait speed, weight loss, exhaustion and low physical activity²⁰, as well as an age-related 243 accumulation of health deficits that leads to poor health and increased risk of adverse 244 outcomes^{3,24}. Recent evidence suggests that the two definitions of frailty, whilst used 245 interchangeably, are likely expressions of distinct phenomena²⁶. Whilst the frailty index 246 247 captures accumulation of deficits and multisystem deterioration with diverse pathophysiological backgrounds, the frailty phenotype has a more unified pathophysiology 248 and can occur in individuals independent of comorbidity and disability^{30,31}. When 249 250 introducing BA into this assessment, complexity increases as consideration of frailty as an 251 index of deficit accumulation along with epigenetic measures of BA have been shown to be jointly predictive of mortality, indicating that the measures capture distinct but 252 complementary age-related phenomena³². In agreement with these findings, out study 253

254 shows that accelerated BA as captured by AnthropoAge identifies age-related changes that are not fully captured by either the frailty index or the frailty phenotype. We also show 255 256 that AnthropoAge is useful to identify individuals with impaired physical performance and 257 deficit accumulation in participants before they fulfill criteria for pre-frailty or frailty, and that could be explored as a potentially useful marker for exceptional longevity in older adults¹². 258 Sarcopenia and decreased muscle function often overlap with frailty in older adults^{33,34}. 259 Older frail adults display a body composition phenotype characterized by decreased 260 appendicular lean mass and increased adiposity³⁵. Previous research has shown sexual 261 dimorphisms in the contribution of body composition for prediction of frailty over time, with 262 visceral and whole-body adiposity being predictive of frailty in women, but not in men^{36,37}. 263 264 Decreased physical activity, immobility and exhaustion may lead to increased visceral 265 adiposity and decreased muscle mass in frail older adults, thus increasing complexity in the relationship between body composition and frailty^{38,39}. In our study, we identified that 266 267 the sexual dimorphisms of accelerated aging captured by AnthropoAge remain present in 268 older non-frail adults but are not observed in pre-frail or frail older adults. This finding likely indicates that pathophysiological and behavioral changes that occur in pre-frail and frail 269 older adults are influenced by accelerated aging, leading to accumulation of visceral 270 271 adiposity, decreased muscle mass, and decreased physical function in men and women. 272 Even though we are unable to establish directionality in cross-sectional associations and our cohort spans a short follow-up time, our results call for further longitudinal studies to 273 274 explore whether accelerated aging impacts body composition changes differentially in frail 275 compared to non-frail older adults.

Our study had several strengths. This is the first study to validate the use of AnthropoAge in a sample of community-dwelling older Mexican adults as a proxy of BA. By using two frailty definitions, we were able to capture both the physical as well as the deficit

279 accumulation phenotype. Finally, by using the longitudinal component of the Coyoacán 280 Cohort study we were able to characterize accelerated aging as a risk factor for frailty 281 progression in older adults, thus establishing AnthropoAgeAccel as a potential frailty 282 marker. We also acknowledge some limitations which should be considered to adequately interpret our results. Despite being an approach previously validated in other studies, the 283 284 modified frailty phenotype implemented in our study does not make use of objective measures such as grip strength or slow gait, as these measures were only available in a 285 286 selected subsample of participants. Thus, the strength of the observed associations may have been underestimated, along with the number of frail and pre-frail participants. 287 Moreover, the use of anthropometry to assess body composition only allows approximate 288 289 inferences on the impact of frailty on the sexual dimorphism in body composition related to 290 accelerated aging, with a need for additional studies based on more precise techniques to 291 explore this phenomenon. Finally, in longitudinal analyses we were able to evaluate 292 changes in the frailty phenotype over time, but not in AnthropoAge or other covariates; 293 despite being able to adjust for their effect at baseline, their dynamic influence over time on frailty progression could not be characterized. Further studies are required to 294 prospectively evaluate the influence of accelerated aging in frailty progression and to 295 296 explore the utility of AnthropoAge as a complementary measure to assess BA in 297 community-dwelling older adults.

298 Conclusions

Our results suggest that, despite being intrinsically intertwined, biological and accelerated aging are phenomena largely independent of frailty both as a phenotype and as an accumulation of age-related deficits. Community-dwelling frail older adults display higher BA acceleration compared to pre-fail and non-frail participants, despite similar CA. Sexual dimorphisms in body composition observed in non-frail participants with accelerated aging

304 are lost in frail older adults with accelerated aging, in whom accumulation of visceral 305 adiposity, decreased appendicular lean mass and physical function are more marked than 306 in frail older adults with non-accelerated aging. Finally, we identified accelerated aging as 307 proxied by AnthropoAgeAccel as a risk factor and a potentially useful biomarker for progression in the severity of the frailty phenotype. Our results are useful to understand 308 309 the complex interplay between BA, deficit accumulation and physical frailty in older adults and highlight the need for prospective studies to understand how they may capture 310 311 different aging mechanisms.

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319 AUTHOR CONTRIBUTIONS

Research idea and study design: CAFM, CGP, LMGR, OYBC; data acquisition: RCCP, LMGR; analysis/interpretation: CAFM, OYBC; statistical analysis: CAFM, OYBC; manuscript drafting: CAFM, DRG, NEAV, MTLT, RCCP, JAS, CGP, LMGR, OYBC; supervision or mentorship: OYBC. Each author contributed important intellectual content during manuscript drafting or revision and accepts accountability for the overall work by ensuring that questions pertaining to the accuracy or integrity of any portion of the work are appropriately investigated and resolved.

327 **DATA AVAILABILITY:** All code and materials are available for reproducibility of results at 328 https://github.com/oyaxbell/anthropoage frailty/

329 **CONFLICT OF INTEREST/FINANCIAL DISCLOSURE:** Nothing to disclose.

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Chronological Age (years)

Figure 1. Relationship between Chronological Age (CA) and AnthropoAge values at baseline stratified by sex in 725 communitydwelling older adults from the Coyoacán Cohort (A). The figure also shows a histogram depicting the distribution of AnthropoAgeAccel values stratified by sex (B).

100

337

10

5

0

AnthropoAgeAccel (years)

-5



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Figure 2. Correlation plot displaying the strength of the linear association of chronological
 age, AnthropoAge, AnthropoAgeAccel, anthropometric and frailty indices in 735
 community-dwelling older adults from the Coyoacán Cohort. *Abbreviations: BMI, Body- mass index; WHtR, Waist-to-height ratio*



Figure 3. Association between AnthropoAgeAccel with frailty scores in 735 community-dwelling older adults, including the frailty index (A), the distribution of frailty indices in individuals with and without accelerated aging, defined as AnthropoAgeAccel values ≥ 0 years (B), as well as the distribution of AnthropoAgeAccel according to number of frailty phenotype items (C). The figure also shows comparisons of AnthropoAgeAccel values across individual components of the frailty phenotype (D-H).



AnthropoAgeAccel ONOn-accelerated Accelerated

349 350 Figure 4. Distribution of accelerated aging defined as AnthropoAgeAccel values ≥0 years 351 in participants according to modified frailty categories at baseline in 735 communitydwelling older adults (A). The figure also shows spider plots comparing anthropometry and 352 physical function for participants with and without accelerated aging according to frailty 353 phenotypes and sex (B-E). Abbreviations: CA, Chronological Age; BMI, Body-mass 354 355 index; WHtR, Waist-to-height ratio; WHR Waist-to-hip ratio.



Figure 5. Association between AnthropoAgeAccel with frailty scores including the frailty index (**A**), the distribution of frailty indices in

- individuals with and without accelerated aging, defined as AnthropoAgeAccel values ≥0 years (B), as well as the distribution of
- 359 AnthropoAgeAccel according to number of frailty phenotype items (**C**).

360 **TABLE 1.** Demographic and clinical characteristics of the study sample, categorized by

	Overall Sample			
Characteristic	Overall N = 735 ¹	Non- Accelerated $N = 400^{1}$	Accelerated $N = 335^1$	p- value ²
Female sex	389 (53%)	206 (52%)	183 (55%)	0.4
Chronological Age	76.0 (73.0, 81.0)	76.0 (73.0, 81.0)	76.0 (73.0, 81.0)	0.3
(years)				
AnthropoAge	76 (72, 81)	74 (71, 79)	77 (74, 83)	<0.001
(years)				
Frailty status				<0.001
Non-fragile	366 (50%)	221 (55%)	145 (43%)	
Pre-frail	284 (39%)	151 (38%)	133 (40%)	
Frail	85 (12%)	28 (7.0%)	57 (17%)	
Frailty index	0.28 (0.23, 0.33)	0.25 (0.23, 0.33)	0.28 (0.23, 0.35)	0.005
BMI (kg/m²)	26.8 (24.0, 29.5)	26.4 (24.3, 28.4)	27.3 (23.5, 31.2)	0.034
Waist-to-height ratio	0.61 (0.56, 0.66)	0.58 (0.54, 0.62)	0.66 (0.60, 0.70)	<0.001
Waist-to-hip ratio	0.96 (0.90, 1.01)	0.92 (0.87, 0.97)	0.99 (0.95, 1.04)	< 0.001
Calt circumterence	33.7 (31.4, 36.3)	34.4 (32.4, 36.3)	32.6 (30.3, 36.1)	<0.001
(cm)				o o o
Arm circumference	28.4 (26.1, 30.7)	28.5 (26.7, 30.5)	28.2 (25.1, 31.1)	0.079
(cm)	00 (40, 00)			0.044
Handgrip strength	20 (16, 26)	21 (17, 27)	20 (15, 25)	0.011
(kg)				0.004
Gait speed (s)	5.6 (4.5, 7.9)	5.4 (4.2, 6.9)	6.4 (4.7, 10.0)	< 0.001
Timed up & go (s)	13.7 (10.8, 16.4)	13.0 (10.4, 15.6)	14.3 (11.0, 17.3)	0.084
Myocardial	63 (8.6%)	35 (8.8%)	28 (8.4%)	0.9
infarction (%)				
Stroke (%)	22 (3.0%)	13 (3.3%)	9 (2.7%)	0.7
Diabetes (%)	157 (21%)	70 (18%)	87 (26%)	0.005
Hypertension (%)	412 (56%)	215 (54%)	197 (59%)	0.2
Cancer (%)	42 (5.7%)	24 (6.0%)	18 (5.4%)	0.7
Dyslipidemia (%)	264 (36%)	142 (36%)	122 (36%)	0.8
				0.2
comorbiaities	105 (050()	100 (070/)	77 (000/)	
0	185 (25%)	108 (27%)	11 (Z3%) 100 (26%)	
1	200 (30%)	144 (30%)	122 (30%)	
2	181 (25%)	101 (25%)	80 (24%) 56 (179()	
≥3 Death at fallow up	103 (14%)	47 (12%)	56 (17%)	0.0
	140	20 (0.9%) 05	JJ (1∠%)	0.2
Erailty status at	149	CO	04	0.017
Francy Status at				0.017
Non fragilo	81 (210/)	10 (27%)	37 (740/)	
Dro froil	138 (520/1)	43 (37 %) 67 (510/)	JZ (Z470) 71 (510/)	
Freil	130 (32%) 11 (17%)	07 (01%) 15 (11%)	7 T (04%) 20 (22%)	
Fiali	44 (1770) 170	260	23 (2270) 202	
UIKNOWN	4/2	209	203	

the presence of accelerated aging as defined by AnthropoAgeAccel values 0 vs. ≥0 years.

¹n (%); Median (IQR), ²Pearson's Chi-squared test; Wilcoxon rank sum test

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