

1 **Associations between IL-6 and trajectories of depressive symptoms**  
2 **across the life course: Evidence from ALSPAC and UK Biobank cohorts**

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## 25 **1. Abstract**

### 26 BACKGROUND

27 Peripheral inflammatory markers, including serum IL-6, are associated with  
28 depression, but less is known about how these markers associate with depression at  
29 different stages of the life-course.

### 30 METHODS

31 We examined associations between serum IL-6 levels at baseline and subsequent  
32 depression symptom trajectories in two longitudinal cohorts: ALSPAC (age 10-  
33 28y;N=4,835) and UK Biobank (39-86y;N=39,613) using multi-level growth curve  
34 modelling. Models were adjusted for sex, BMI and socioeconomic factors.  
35 Depressive symptoms were measured using the Short Moods and Feelings  
36 Questionnaire (SMFQ) in ALSPAC (max timepoints=11) and the Patient Health  
37 Questionnaire-2 (PHQ-2) in UK Biobank (max timepoints=8).

## 38 RESULTS

39 Higher baseline IL-6 was associated with worse depression symptom trajectories in  
40 both cohorts (largest effect size: 0.046 (ALSPAC, age 16y)). These associations  
41 were stronger in the younger ALSPAC cohort, where additionally higher IL-6 at age 9  
42 years was associated with worse depression symptoms trajectories in females  
43 compared to males. Weaker sex differences were observed in the older cohort, UK  
44 Biobank. However, statistically significant associations ( $p_{FDR} < 0.05$ ) were of small  
45 effect sizes, typical of large cohort studies.

## 46 CONCLUSIONS

47 These findings suggest that systemic inflammation may influence the severity and  
48 course of depressive symptoms across the life course, which is apparent regardless  
49 of age and differences in measures and number of time points between these large,  
50 population-based cohorts.

51 **2. Introduction**

52 There is substantial evidence to suggest low grade inflammation, as reflected by  
53 elevated levels of circulating inflammatory markers, such as C-reactive protein  
54 (CRP) and a cytokine interleukin 6 (IL-6), in the blood and cerebrospinal fluid (CSF),  
55 may contribute to the aetiology of depression [1-4]. Neuroimaging and post-mortem  
56 brain studies have shown increased markers of neuroinflammation in individuals with  
57 depression compared to controls [4-6]. Further, peripheral inflammatory markers  
58 have been shown to associate with changes in brain structure in both observational  
59 [7, 8] and Mendelian randomisation (MR) [9] studies, suggesting a potential  
60 mechanism by which inflammation may have a role in depression. Longitudinal  
61 studies have shown increased blood IL-6, but not CRP, levels in childhood associate  
62 with depressive and psychotic symptoms in early adulthood [10-12]. Increased  
63 inflammatory markers have been also shown to associate with worse depressive  
64 symptom severity, including in an MR study that found a potential causal association  
65 of IL-6 with suicidal thoughts [13, 14]. Causal evidence also comes from RCTs  
66 showing anti-inflammatory treatment for chronic inflammatory conditions improves  
67 depressive symptoms independent of improvement in physical symptoms and other  
68 MR studies suggesting putative causality of IL-6 on major depressive disorder [15,  
69 16]. Other clinical trials on anti-inflammatory agents as adjunctive treatment for  
70 depression have resulted in mixed results [17-20], with effective treatment outcomes  
71 more commonly found when stratifying by baseline inflammatory markers [18, 19].

72 Further, there is some pilot evidence to suggest such stratification may be more  
73 pertinent in females compared to males [21].

74 Depression affects individuals across the entire life course with an onset typically  
75 occurring between ages 20 to 30 years [22, 23]. However, there are few studies  
76 investigating the effect of baseline inflammation on the longitudinal patterns of  
77 depressive symptoms over the life course. A study using latent class analysis in the  
78 ALSPAC cohort showed that serum IL-6 levels at age 9 years associated with a  
79 trajectory group of persistently worse depressive symptoms from ages 10 to 19  
80 years [24]. A study also using latent class analysis in The Netherlands Study of  
81 Depression and Anxiety (NESDA) cohort (age 18 to 65 years at baseline) found  
82 increased inflammatory blood markers associated with an atypical depression  
83 subgroup [25]. Over a 6-year follow-up this subgroup had higher BMI and rate of  
84 metabolic syndrome compared to a melancholic depression subgroup and controls  
85 [26]. Similar findings of increased prevalence of metabolic syndrome in an atypical  
86 depression latent class were also found in older individuals (aged 60 years or older,  
87 N=510) in The Netherlands Study of Depression in Older persons (NESDO) cohort  
88 [27]. However, none of these studies directly examine the effects of inflammation  
89 over a larger period of the life course.

90 Examining the effects of inflammation on depression across the life course provides  
91 insight into the heterogeneity and underlying mechanisms of depression at specific  
92 developmental stages, aiding the development of biologically based stratification.

93 Depression is highly heterogeneous and there is increasing cross-sectional evidence

94 that an inflammatory subgroup of depression exists, associated with worse  
95 depressive symptom severity [13, 28]. Therefore, it is crucial to examine whether  
96 increased inflammation associates with increased depression symptom severity over  
97 different stages of the life course. One such method for understanding the  
98 longitudinal relationships between inflammation and depression is trajectory analysis  
99 [29]. Briefly, this method assesses the patterns of change in depressive symptoms  
100 over time (trajectories) for individuals or groups of individuals from repeated  
101 assessments of depression symptoms [29]. This then facilitates the investigation into  
102 risk factors that may influence the course of these trajectories and whether these  
103 effects persist over time.

104 Additionally, it is known there is a sex difference in both depression and inflammation  
105 [29-32]. Evidence suggests these sex differences extend into differences in  
106 inflammatory-associated depression, especially in adolescence but with inconsistent  
107 findings in later life [33-36]. There is a need to understand the sex differences more  
108 fully at different stages of the life course, whilst assessing repeated measures of  
109 subsequent depression.

110 Here, we used multi-level growth curve modelling to investigate the effects of IL-6 on  
111 subsequent trajectories of depressive symptoms in two longitudinal cohorts:  
112 ALSPAC (age 10-28y) and UK Biobank (39-86y). Due to previous observational  
113 longitudinal and MR studies showing stronger effects of serum IL-6 compared to  
114 CRP with depression, the focus of this study is on IL-6 [9-12, 16]. Specifically, we  
115 tested whether increased baseline measures of serum IL-6 are associated with

116 worse trajectories of depressive symptoms and if this effect is seen consistently  
117 across two different cohorts spanning early and later life. Individuals were divided  
118 into groups based on IL-6 tertiles, with the bottom third tertile group consisting of  
119 people with lower levels of IL-6 and the top third tertile group consisting of people  
120 with higher levels of IL-6, as has been studied previously [37, 38]. We also tested if  
121 there was a sex difference in the relationship between IL-6 and subsequent  
122 trajectories of depressive symptoms, by stratifying analysis by sex. Finally, due to  
123 the difficulty in interpreting the effects of polynomial trajectory models, we also  
124 calculated the mean depressive scores for each IL-6 tertile trajectory and assessed  
125 the differences in depressive scores between the top and bottom third IL-6 tertile  
126 trajectories of depressive symptoms, at different ages.

### 127 **3. Materials and methods**

#### 128 **3.1 Study Sample**

##### 129 **3.1.1 ALSPAC Cohort**

130 ALSPAC is an ongoing, longitudinal, prospective, population-based study in South-  
131 West England investigating the impact of various exposures on health and  
132 developmental outcomes [39-41]. Initially 14,541 pregnant mothers with an  
133 estimated delivery date between April 1991 and December 1992 were recruited. This  
134 resulted in 14,092 live births and 13,988 children still alive after one year. When the  
135 oldest children were approximately 7 years of age, an attempt was made to bolster  
136 the initial sample with eligible cases who had failed to join the study originally. The

137 total sample size for analyses using any data collected after the age of seven is  
138 therefore 15,447 pregnancies, of which 14,901 children were alive at 1 year of age.  
139 Further details of this study cohort are described in the cohort profile publications  
140 [39-41]. Demographics of ALSPAC participants used within the current study are  
141 shown in Table 1. Number of participants at each age for each time point is shown in  
142 Supplementary Table 1.

### 143 **3.1.2 UK Biobank Cohort**

144 UK Biobank is a large, population-based, prospective study, aiming to investigate  
145 contributing factors to a wide range of health-related outcomes [42]. UK Biobank  
146 consists of over 500,000 participants, aged 39-69 years when recruited between  
147 2006 and 2010 over 22 assessment centres throughout the UK  
148 (<http://www.ukbiobank.ac.uk/>).

149 Data collection occurred at both in-person assessment visits and remote online  
150 follow-up questionnaires. In-person assessment visits included an initial assessment  
151 visit (2006-2010), first repeat assessment visit (2012-2013), an imaging visit (2014+)  
152 and a repeat imaging visit (2019+) [42, 43]. Online follow-up questionnaires included  
153 assessments such as mental health (2016-2017), experiences of pain (2019), health  
154 and well-being (2022+) and mental well-being (2022+). Demographics of UK  
155 Biobank participants used within the current study are shown in Table 2. Number of  
156 participants at each age for each time point is shown in Supplementary Table 2.



## 157 **3.2 Measures of depressive symptoms**

### 158 **3.2.1 ALSPAC Cohort**

159 The Short Mood and Feelings Questionnaire (SMFQ) was used to assess self-  
160 reported depressive symptoms at 11 time points between the ages of 10 to 28 years  
161 (Supplementary Figure 1, Supplementary Table 3). The SMFQ was administered via  
162 mail/email or in clinics. There were four clinic time points (ages 10, 12, 14 and 18  
163 years) and seven remote self-reported (mail) time points (ages 17, 19, 22, 23, 24, 26  
164 and 28 years). The SMFQ is a 13-item questionnaire that measures the presence of  
165 depressive symptoms within the last two weeks [44]. The SMFQ has been used in  
166 clinical populations to assess depressive symptoms [45] and has been shown to  
167 predict clinical depression in ALSPAC [44]. Supplementary Table 4 lists the SMFQ  
168 items. Each item response is scored from 0 to 2 (0 = “not true”, 1 = “sometimes”, 2 =  
169 “true”), where the total summed score ranges from 0 to 26 and where a higher score  
170 corresponds to worse depressive symptoms. The mean number of time points per  
171 participant was 6.12 (median = 6, mode =3).

### 172 **3.2.2 UK Biobank Cohort**

173 Depressive symptoms were assessed at 8 time points (four in-person and four online  
174 follow-up questionnaire assessments) using questions from the Patient Health  
175 Questionnaire-2 (PHQ-2) which reflect depressed mood and anhedonia  
176 (Supplementary Table 5) [46]. PHQ-2 has previously been shown to be a valid  
177 screening tool for detecting depression [47-49]. The mean, standard deviation, min,

178 max and interquartile range of ages at each time point is described in Supplementary  
179 Table 6 and Supplementary Figure 2. The mean number of time points per  
180 participant was 2.56 (median = 2, mode = 1).

### 181 **3.3 Measures of blood serum IL-6**

#### 182 **3.3.1 ALSPAC Cohort**

183 Blood samples were collected at age 9 years (mean age:9.86 years; SD:0.31) and  
184 high sensitivity serum CRP and IL-6 were measured in 5,059 participants. Details of  
185 laboratory methods are described in detail previously [10]. Individuals with serum  
186 CRP  $\geq$  10mg/L (N = 60) were excluded from the main analysis to minimise  
187 confounding by chronic inflammatory condition or acute infection [50], consistent with  
188 previous studies [10, 38]. The final sample used for analysis consisted of 4,999  
189 participants.

#### 190 **3.3.2 UK Biobank Cohort**

191 Proteomic data was extracted by Olink by analysing blood samples collected at the  
192 initial assessment from a subset of UK Biobank participants (N = 54,239)  
193 ([https://biobank.ctsu.ox.ac.uk/crystal/ukb/docs/Olink\\_proteomics\\_data.pdf](https://biobank.ctsu.ox.ac.uk/crystal/ukb/docs/Olink_proteomics_data.pdf)) [51]. This  
194 subset of participants consisted of 46,595 randomly selected participants from the  
195 initial assessment visit, 6,376 participants selected for the UKB-PPP study and 1,268  
196 participants who participated in a COVID-19 repeat-imaging study at multiple visits  
197 [51]. 2,923 unique proteins were measured using Olink Explore 3072 Proximity  
198 Extension Assay. This including IL-6 protein which was measured in 44,076

199 participants. Further details on Olink proteomics data are described by UK Biobank  
200 here: [https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink\\_proteomics\\_data.pdf](https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink_proteomics_data.pdf),  
201 [https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink\\_1536\\_B0\\_to\\_B7\\_Analysis\\_Report.p](https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink_1536_B0_to_B7_Analysis_Report.pdf)  
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207 [doc.pdf](https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/PPP_Phase_1_QC_dataset_companion_doc.pdf). Individuals with CRP  $\geq 10$  mg/L (N = 1,758) were excluded from the main  
208 analysis, to minimize confounding by acute infection and keep analysis consistent to  
209 ALSPAC analysis. Details of blood sampling processing for CRP are described by  
210 UK Biobank here: <https://biobank.ndph.ox.ac.uk/ukb/ukb/docs/haematology.pdf>,  
211 [https://biobank.ndph.ox.ac.uk/showcase/showcase/docs/serum\\_biochemistry.pdf](https://biobank.ndph.ox.ac.uk/showcase/showcase/docs/serum_biochemistry.pdf),  
212 [https://www.ukbiobank.ac.uk/media/oiudpiqa/bcm023\\_ukb\\_biomarker\\_panel\\_website\\_v1-0-](https://www.ukbiobank.ac.uk/media/oiudpiqa/bcm023_ukb_biomarker_panel_website_v1-0-aug-2015-edit-2018.pdf)  
213 [aug-2015-edit-2018.pdf](https://www.ukbiobank.ac.uk/media/oiudpiqa/bcm023_ukb_biomarker_panel_website_v1-0-aug-2015-edit-2018.pdf). The final sample used for analysis consisted of 40,069  
214 participants (mean age for baseline IL-6 measurement: 56.6 years; SD:8.10).

## 215 **3.4 Statistical analysis**

### 216 **3.4.1 Deriving trajectories of depressive symptoms**

217 Multi-level growth curve modelling was conducted in R, using the “lme4” package, to  
218 create population averaged trajectories of depression [52]. Briefly, multi-level growth  
219 curve modelling clusters repeated measures within individuals. Unlike traditional  
220 linear regression, which treats each observation as independent, multi-level growth

221 curve modelling recognises that repeated measures within the same individual are  
222 likely to be correlated, which reduces bias. Furthermore, multi-level growth curve  
223 modelling enables the exploration of individual trajectories of change over time. By  
224 allowing for random effects at both the individual level and the group level, this  
225 approach can capture not only mean population trends across the entire sample but  
226 also variations in trajectories among different individuals or groups.

227 Age was centered to 10 years in ALSPAC and 39 years in UK Biobank (the minimum  
228 age of all assessments in each cohort) in order to improve model convergence and  
229 better interpretation of the results. Continuous covariate variables were Z-score  
230 scaled.

231 We assessed both linear and non-linear (quadratic, cubic and quartic) models. The  
232 fit of the model was assessed using Bayesian Information Criterion (BIC) and  
233 likelihood ratio test (LRT). A quartic model fitted the ALSPAC data best and a  
234 quadratic model fitted the UK Biobank data best (Supplementary Tables 7-8).

235 The models included repeated measures per participant of SMFQ scores for  
236 ALSPAC and PHQ-2 scores for UK Biobank and age at which the depression  
237 questionnaire was completed. In ALSPAC the intercept and four polynomial age  
238 terms were able to vary across individuals to capture each individual's unique  
239 trajectory (ie. random intercept and random slopes model). In UK Biobank the  
240 intercept and only linear age terms were able to vary across individuals (ie. random  
241 intercept and random linear slope model). The model did not converge when also  
242 including a random quadratic slope term or when trying a cubic model. Both

243 ALSPAC and UK Biobank models included unstructured covariance terms for the  
244 random effects.

245 To examine how IL-6 associated with changes in depressive symptoms, we split  
246 participants into IL-6 tertile groups [10, 38]. The models included fixed effects of IL-6  
247 tertile and an interaction of IL-6 tertiles with each of the fixed-effect age polynomial  
248 terms. The rationale for this is that categorical groupings of low, medium and high  
249 inflammation is more intuitive to interpret in trajectory models compared to a  
250 continuous variable and is easier to visualise. The IL-6 values of the tertile cut-offs  
251 for UK Biobank were: minimum bottom tertile = -2.34, between bottom and middle  
252 tertiles = -0.310, between middle and top tertiles = 0.304 and maximum top tertile =  
253 10.6. UK Biobank IL-6 data is provided after they apply an in-house normalisation  
254 method which involves a log<sub>2</sub> transformation

255 ([https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink\\_1536\\_B0\\_to\\_B7\\_Normaliz](https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink_1536_B0_to_B7_Normalization.pdf)  
256 [ation.pdf](https://biobank.ndph.ox.ac.uk/showcase/ukb/docs/Olink_1536_B0_to_B7_Normalization.pdf)). The IL-6 values (mg/ml) of the tertile cut-offs for ALSPAC were: minimum  
257 bottom tertile = 0.007, between bottom and middle tertiles = 0.588, between middle  
258 and top tertiles = 1.12 and maximum top tertile = 20.1.

### 259 **3.4.2 Calculating mean depressive symptom scores**

260 To assess the association between IL-6 tertile groups and development of symptoms  
261 over time, we created a population trajectory for each IL-6 tertile group. We then  
262 calculated the mean depressive symptoms scores at ages 10, 13, 16, 19, 22, 25 and  
263 28 years in ALSAPC and ages 40, 50, 60, 70 and 80 years in UK Biobank for each of  
264 these trajectories, in the fully adjusted models. These ages were chosen to reduce

265 the number of multiple tests performed whilst still capturing potentially important  
266 developmental changes over time. We then calculated the differences in mean  
267 depressive symptoms scores at each of these ages of the IL-6 tertile groups in a  
268 pair-wise manner. Further information on how these scores and their differences  
269 were calculated for the trajectories is presented elsewhere [29]. Briefly, the  
270 depressive symptom scores were calculated for each IL-6 tertile group trajectory.  
271 The delta method (which incorporates the estimate, standard errors and confidence  
272 intervals) was then used to compare these two scores (ie. upper vs lower tertile,  
273 lower vs middle tertile, upper vs middle tertile in turn) revealing a mean difference in  
274 scores that are derived estimates from each trajectory. Differences in scores were  
275 transformed to Z-scores to compare results between ALSPAC and UK Biobank  
276 (detailed in Supplementary Methods). P-values were adjusted for multiple testing  
277 using the false discovery rate (FDR). The number of multiple tests were the number  
278 of different time points used to calculate scores for (ALSPAC: n tests = 7; UK  
279 Biobank: n tests = 5).

### 280 **3.4.3 Confounders**

281 Confounders used in the ALSPAC models were the same as described in  
282 Edmondson-Stait et al. (2022). Three main models were used, the first was an  
283 unadjusted model with no covariates added, the second was adjusted for sex only  
284 and the third fully adjusted model further included covarying for log-transformed BMI  
285 (at age 9 years) and maternal education as a marker of socioeconomic status [53,  
286 54]. Maternal education was coded as a binary variable as either “CSE/O-

287 level/Vocational education” or “A-level/degree level of education”. Sex was coded as  
288 a binary variable as either “Male” or “Female”. BMI (age 9 years) was calculated by  
289 dividing weight (kg) by squared height (meters). Distributions and participant counts  
290 of these variables are shown in Supplementary Figure 3.

291 Confounders used in the UK Biobank models were similar to those used in the  
292 ALSPAC cohort. Three main models were used, the first was a minimally adjusted  
293 model with covariates for protein batch and assessment centre at the initial  
294 assessment. These two covariates were not available in the ALSPAC cohort due to  
295 there being only one assessment centre (unlike UK Biobank that had multiple  
296 assessment centres) and a protein assay (ELISA) that did not include a batch  
297 variable in ALSPAC [10]. The second model was additionally adjusted for sex. The  
298 third fully adjusted model included further covarying for log-transformed BMI (at the  
299 time of blood sample collection), smoking status and Townsend deprivation index as  
300 a marker of socioeconomic status as these have been previously shown to associate  
301 with inflammation or psychiatric disorders [55, 56]. Distributions and participant  
302 counts of these variables are shown in Supplementary Figure 4.

#### 303 **3.4.4 Missing data**

304 Missing outcome data in the trajectories analysis were addressed using full  
305 information maximum likelihood estimation (FIML), as part of the “lmer” function from  
306 the “lme4” package in R [52, 57]. Briefly, this assumes that the probability of an  
307 individual missing a measure of depressive symptoms does not depend on their  
308 underlying depressive symptoms score at that occasion, given their observed

309 depressive symptoms trajectory at other occasions. We included individuals into the  
310 analysis if they had at least one measurement of depression symptoms in order to  
311 maximise power [58].

### 312 **3.4.5 Sensitivity analyses**

313 Sensitivity analyses involved investigating the impact of sex, tertile categorisation of  
314 IL-6, the impact of anti-inflammatory medication and impact of attrition. Previous  
315 studies have shown trajectories of depression are different for males and females  
316 [29, 30]. Therefore, we created a new variable that split the IL-6 tertiles by sex:  
317 female & bottom third IL-6 tertile, female & middle third IL-6 tertile, female & top third  
318 IL-6 tertile, male & bottom third IL-6 tertile, male & middle third IL-6 tertile and male &  
319 top third IL-6 tertile. The models were then run splitting the trajectories on this sex-  
320 split IL-6 tertile variable and analysed the same way as in the main analysis. To  
321 assess the effect of tertile categorisation of IL-6, we ran the analysis using a  
322 continuous measure of IL-6 (which was inverse normal transformed to achieve  
323 normal distribution and Z-score scaled) and compared the model estimates. The  
324 impact of inflammatory medication was assessed by removing individuals that might  
325 be taking medication that affects inflammation (ALSPAC N removed = 695; UK  
326 Biobank N removed = 10,652). In ALSPAC, the only measure available for  
327 medication at age 9 years (when IL-6 was measured) was a general variable of  
328 “Currently taking medication?”, therefore this may include medications that do not  
329 impact inflammation. In UK Biobank, anyone taking anti-inflammatory medications  
330 were removed (Supplementary Material; Supplementary Table 9). To assess



331 attrition, we used linear regression to test for associations between IL-6 tertile on the  
332 number of questionnaires completed. In UK Biobank, the two imaging time points  
333 were excluded in this count as only a subset of individuals were invited to attend  
334 these appointments. To further assess attrition, we also ran the trajectory models  
335 limiting individuals to only those that had attended at least two assessments.

336 Additionally, we assessed the differences in markers of socioeconomic status used  
337 in ALSPAC and UK Biobank. To ensure consistency with our previous ALSPAC  
338 study we used maternal education as a marker of socioeconomic status [11].  
339 However, Townsend deprivation index was used as a marker of socioeconomic  
340 status in UK Biobank as no measure of maternal education was available. Therefore,  
341 we also conducted a sensitivity analysis in ALSPAC using Townsend deprivation  
342 index quintiles as a covariate in place of maternal education allowing a comparison  
343 of results between ALSPAC and UK Biobank (Supplementary Material,  
344 Supplementary Figure 5).

345 In UK Biobank various other sensitivity analyses were performed. Other factors that  
346 may affect inflammation included inflammatory conditions and high BMI. Individuals  
347 with an inflammatory condition were identified and removed (N removed = 6,342),  
348 using definitions of 49 conditions [59] (Supplementary Table 10). Individuals with  
349 BMI  $\geq 40$  were also removed (N removed = 577), as inflammation associates with  
350 high BMI (Supplementary Material) [3]. Finally, to assess attrition due to death we  
351 removed people who had died after the initial baseline appointment. Further details

352 are in the Supplementary Material. Similar analysis was not conducted in ALSPAC  
353 due to this cohort being a younger age.

## 354 **4. Results**

### 355 **4.1 Sample characteristics of ALSPAC**

356 A total of 4,999 individuals had serum IL-6 data and CRP < 10 mg/L, of these 4,835  
357 had at least one measurement of depressive symptoms (measured by the SMFQ).  
358 Sample characteristics of this sample are shown in Table 1, split by IL-6 tertile.

### 359 **4.2 Sample characteristics of UK Biobank**

360 A total of 40,069 individuals had IL-6 data and CRP < 10 mg/L, of these 39,613 had  
361 at least one measurement of depressive symptoms (measured by PHQ-2; 18,958  
362 had depressive symptoms measured only at the initial assessment). Sample  
363 characteristics of this sample are shown in Table 2, split by IL-6 tertile. IL-6 was  
364 measured in the initial assessment in which participant ages ranged from age 39-70  
365 years (mean: 56.6 y; SD:8.10). The mean ages varied for participants in each IL-6  
366 tertile (bottom third: mean: 54.31y, SD: 8.13; middle third: mean: 57.30y, SD: 7.94;  
367 top third: mean: 58.53y, SD: 7.60).

368 **4.3 Associations of baseline IL-6 with subsequent depressive**  
369 **symptoms trajectories in ALSPAC**

370 In the fully adjusted model (sex, BMI and maternal education), the overall pattern of  
371 depressive symptom trajectories increased from ages 10 to 20 years, followed by a  
372 plateau from 22 years onwards. The top third IL-6 tertile group had a higher  
373 trajectory compared to both the middle and bottom third IL-6 tertile groups, indicating  
374 increased depressive symptoms across this period (Figure 1A, Supplementary Table  
375 11). However, confidence intervals overlapped across all IL-6 tertile group  
376 trajectories. Model estimates for all models (unadjusted, sex adjusted and fully  
377 adjusted) are presented in Supplementary Table 12. In the fully adjusted model, the  
378 intercept score at age 10 years for the baseline group (bottom third IL-6 tertile) was  
379 1.1192 (SE=0.9868), the linear rate of change was <0.001 (SE=0.12), the quadratic  
380 rate of change was 0.1355 (SE=0.0274), the cubic rate of change was <0.0001  
381 (SE=0.0022) and the quartic rate of change was 0.0003 (SE<0.0001). The  
382 interaction between the top third IL-6 tertile and linear age strongly associated with  
383 depressive symptoms at the age at the intercept (10 years) ( $\beta = 0.3581$ ,  $p = 0.037$ ;  
384 Supplementary Table 12). All other IL-6 tertile terms and their interactions with age  
385 did not associate with depressive symptoms at the age at the intercept (10 years)  
386 (Supplementary Table 12).

387 Given the difficulty in interpreting non-linear trajectories (i.e., positive linear  
388 polynomial terms, and negative quadratic polynomial terms), we report the mean  
389 differences at various ages across youth development between the bottom third and

390 top third IL-6 tertile groups. There was evidence for a difference in depressive  
391 symptom scores between the top third and bottom third IL-6 tertiles across  
392 adolescence at ages 13 (SMFQ Score<sup>diff</sup>=0.41, 95%CI 0.126 - 0.694, pFDR=0.0327)  
393 and 16 years (SMFQ Score<sup>diff</sup>=0.573, 95%CI 0.258 - 0.888, pFDR=0.0025), but not  
394 the other ages tested (10, 19, 22, 25 and 28 years) (Figure 1B, Table 3).

395 There was evidence for differences in trajectories between females and males when  
396 splitting each IL-6 tertile group by sex. Depression trajectories and mean depressive  
397 scores across all IL-6 tertiles were worse in females compared to males (Figure 2A,  
398 Table 4, Supplementary Table 13). Females in the top third IL-6 tertile group  
399 generally had worse trajectories. There was evidence for a difference in depressive  
400 symptom scores between the top third and bottom third IL-6 tertiles in females, but  
401 not males, at ages 13 and 16 years (Figure 2B, Table 4, Supplementary Table 14).

402 Similar results were also seen when using a continuous measure of IL-6, when  
403 individuals taking any medication were removed and when using Townsend  
404 deprivation index quintiles in place of maternal education (Supplementary Tables 15-  
405 17). These results were unlikely to be bias by attrition as IL-6 tertiles did not  
406 associate with the number of completed questionnaires (Supplementary Table 18,  
407 Supplementary Figure 6). Additionally, similar results were seen in the trajectory  
408 models when limiting the sample to individuals that had attended at least two  
409 assessments (Supplementary Table 19; Supplementary Figure 7).

410 **4.4 Associations of baseline IL-6 with subsequent depressive**  
411 **symptoms trajectories in UK Biobank**

412 In the fully adjusted model (sex, BMI, batch, assessment centre, Townsend  
413 deprivation index and smoking status), the overall pattern of depressive symptom  
414 trajectories decreased from age 39 years until mid 60 years where they begin to  
415 increase. The top third IL-6 tertile group had a higher trajectory compared to both the  
416 middle and bottom third IL-6 tertile groups, indicating increased depressive  
417 symptoms across this period (Figure 3A, Supplementary Table 20). However,  
418 confidence intervals overlapped across all IL-6 tertile group trajectories. Model  
419 estimates for all models (unadjusted, sex adjusted and fully adjusted are presented  
420 in Supplementary Table 21. In the fully adjusted model, the intercept score at age 39  
421 years for the baseline group (bottom third IL-6 tertile) was 0.8401 (SE=0.1338), the  
422 linear rate of change was  $<0.001$  (SE=0.0022) and the quadratic rate of change was  
423  $<0.0001$  (SE $<0.0001$ ). All the IL-6 tertile terms and their interactions with age were  
424 strongly associated with depressive symptoms at the intercept age of 39 years.  
425 Specifically, the middle and top third IL-6 tertile positively associated with depressive  
426 scores at the intercept age of 39 years compared to the lower third IL-6 tertile group  
427 (middle third IL-6 tertile:  $\beta=0.1417$ ,  $p=0.0004$ ; top third IL-6 tertile:  $\beta=0.2041$ ,  
428  $p<0.0001$ ). The interactions between the middle and top third IL-6 tertile and linear  
429 age were also associated with depressive symptoms (middle third IL-6 tertile x linear  
430 age:  $\beta<0.0001$ ,  $p=0.0003$ ; top third IL-6 tertile x linear age:  $\beta<0.0001$ ,  $p<0.0001$ ).  
431 Additionally, interactions between the middle and top third IL-6 tertile and quadratic

432 age were associated with depressive symptoms (middle third IL-6 tertile x quadratic  
433 age:  $\beta=0.0002$ ,  $p=0.0015$ ; top third IL-6 tertile x quadratic age:  $\beta=0.0003$ ,  $p<0.0001$ ).

434 There was evidence for a difference in depressive symptom scores between the top  
435 third and bottom third IL-6 tertile groups at ages 40 (PHQ-2 Score<sup>diff</sup>=0.187, 95%CI  
436 0.105 - 0.27 ,  $pFDR<0.0001$ ), 50 (PHQ-2 Score<sup>diff</sup>=0.059, 95%CI 0.021 - 0.097,  
437  $pFDR=0.0111$ ) and 80 years (PHQ-2 Score<sup>diff</sup>=0.086, 95%CI 0.026 - 0.147,  
438  $pFDR=0.0257$ ), but not the other ages tested (Figure 3B, Table 5).

439 There was evidence for differences between females and males when splitting each  
440 IL-6 tertile group by sex. Depression trajectories and mean depressive scores across  
441 all IL-6 tertiles were generally worse in females compared to males (Figure 4A,  
442 Supplementary Table 22). There was evidence for a difference in depressive  
443 symptom scores between the top third and bottom third IL-6 tertiles in both males  
444 and females at age 40 years, in males only at age 50 years, but not for ages 60, 70  
445 or 80 years (Figure 4B, Table 6, Supplementary Table 23).

446 Similar results were also seen when using a continuous measure of IL-6, when  
447 individuals taking anti-inflammatory medication were removed, when individuals with  
448 inflammatory conditions were removed, when individuals with BMI  $\leq 40$  were  
449 removed and when subsetting to only participants that were alive after the initial  
450 appointment (Supplementary Tables 24-28). However, these results may have been  
451 biased by attrition as IL-6 tertiles were associated with the number of completed  
452 questionnaires in the sample of participants that remained alive after the initial  
453 assessment (Supplementary Table 29, Supplementary Figures 8-9). Additionally,

454 trajectory models with samples limited to individuals that had attended at least two  
455 assessments showed smaller effect sizes than in the main analysis (Supplementary  
456 Table 30; Supplementary Figure 10).

## 457 **5. Discussion**

458 Longitudinal trajectories of depressive symptoms were modelled to investigate the  
459 effects of baseline IL-6 on depressive symptoms in two cohorts spanning different  
460 stages of the life course (ALSPAC and UK Biobank). Higher IL-6 was associated  
461 with worse trajectories of depression symptoms across the life course. This  
462 relationship was stronger the younger cohort (ALSPAC), compared to the older  
463 cohort (UK Biobank). Sex differences were also consistent in both cohorts but  
464 stronger in the younger cohort (ALSPAC), where the association between higher IL-6  
465 and worse depression trajectories were stronger in females compared to males.

466 The main strengths of this study are the use of two large-scale population cohorts  
467 with prospectively collected data and repeated measures of depression symptoms at  
468 11 assessments across ages 9 to 28 years in ALSPAC and 8 assessments across  
469 ages 39 to 80 years in UK Biobank. This permitted the investigation of identifying the  
470 ages where increased IL-6 associated with worse depression trajectories and  
471 whether these effects were persistent across different stages of the life course.

472 Similar relationships were observed between IL-6 and depression trajectories in two  
473 different cohorts despite their heterogeneity and no overlap in ages. Also presented  
474 is an alternative way of interpreting trajectory results by looking at mean differences

475 in scores at ages, which has only recently been developed in the field of longitudinal  
476 epidemiology [29, 60].

477 The overall pattern of depression trajectories in ALSPAC was consistent with  
478 previous studies of the same cohort [29, 61]. Depressive symptoms increased from  
479 ages 10 to 20 years, followed by a plateau from 22 years onwards. Depression  
480 trajectories have been modelled in other cohorts and show a similar pattern to the  
481 UK Biobank results in this current study [31], whereby symptoms decrease from age  
482 40 years until mid 60 years where they begin to increase again. There was evidence  
483 that people with higher IL-6 (ie. in the top third IL-6 tertile group) had worse  
484 trajectories than those with lower IL-6 (ie. in bottom third and middle third IL-6 tertile  
485 groups), with the greatest difference in mean depressive symptom scores between  
486 the top third and bottom third IL-6 tertile groups observed at ages 13 and 16 years in  
487 ALSPAC and 40, 50 and 80 years in UK Biobank. The Z-scores of the mean  
488 differences for these ages were also comparable between ALSPAC and UK  
489 Biobank, with slightly larger mean differences in ALSPAC (0.039-0.046) compared to  
490 UK Biobank (0.011-0.018). This suggests that at various points across the life  
491 course, higher IL-6 associates with worse depression symptom trajectories, with a  
492 relatively greater impact of IL-6 on depressive symptoms in younger compared to  
493 older people. Inflammation has been shown to associate with changes in brain  
494 structure which could be one mechanism by which inflammation may contribute to  
495 depression, especially during this vulnerable period of neurodevelopment [7, 8, 62].  
496 An MR study investigating the effect of peripheral inflammatory markers on brain  
497 structure in older adults from UK Biobank found potential causal mechanisms for



498 serum IL-6 on regions associated with major psychiatric disorders (temporal,  
499 fusiform and frontal cortices) [9]. Chronic, systemic inflammation is also associated  
500 with increased age, termed “inflammaging”, which has been linked to various age-  
501 related illnesses [63]. Brain related inflammaging such as increased  
502 neuroinflammation and reduced blood-brain barrier integrity which are proposed  
503 mechanisms for depression in later life [63]. Additionally, it may be that other  
504 environmental and social factors having more prominent effects on depression at  
505 later stages of the life course [64]. It should also be noted that there is a difference in  
506 IL-6 assay method used in ALSPAC and UK Biobank. ALSPAC used ELISA which is  
507 commonly used for assessing IL-6 measures. Whereas UK Biobank used Olink  
508 which is a high-throughput method and may not be as accurate as ELISA.  
509 Additionally, these measures are on different scales. ALSPAC IL-6 data is provided  
510 as raw pg/ml measurements whereas UK Biobank is provided after they apply an in-  
511 house normalisation method which involves a log<sub>2</sub> transformation.

512 The findings in this study are in line with previous studies. Previous studies have  
513 shown higher IL-6 is associated with depressive symptoms in both a cross-sectional  
514 and cross-lag relationship [3, 10, 16, 24, 38, 65]. Our previous study found IL-6 was  
515 associated with the total number of depressive episodes, representing increased  
516 burden of depression in ALSPAC [11]. Cross-sectionally, an inflammatory subgroup  
517 of depression has been shown to associate with depression severity [13]. Another  
518 study using latent class analysis in ALSPAC showed that baseline serum IL-6 levels  
519 was associated with a trajectory group of persistently worse depressive symptoms  
520 from ages 10 to 19 years [24]. This current study complemented and extended these

521 studies in numerous ways. Firstly, by extending the age range investigated in  
522 ALSPAC to also include a period of early adulthood (up to 28 years) in which  
523 development of psychiatric disorders can occur. Secondly, analysis was conducted  
524 in cohorts of both younger (ALSPAC) and older (UK Biobank) age with prospectively  
525 collected data. Thirdly, population level trajectories of depressive symptoms were  
526 assessed using multi-level growth models, rather than probabilistic membership into  
527 groups of individuals identified from latent class analysis. Briefly, multi-level growth  
528 modelling clusters repeated measures within individuals to capture changes over  
529 time. It can also model random effects at both the individual level and the group  
530 level. This allows for the assessment of not only mean population trends across the  
531 entire sample but also variations in trajectories among different individuals or groups  
532 (eg. IL-6 tertile subgroups or males and females). Whereas latent class modelling  
533 assumes there are homogenous subgroups that follow similar longitudinal  
534 trajectories, and estimates these unobserved (latent) subgroups, rather than  
535 modelling predefined or observed groups [66].

536 The choice of using multi-level modelling for this study was decided based on  
537 several factors. Firstly, a limitation of latent class modelling in the context of this  
538 study is the sensitivity to the number of time points included in the analysis and the  
539 comparison between what different latent classes might mean between the ALSPAC  
540 and UKB cohorts (i.e., what might increasing and decreasing trajectories mean in the  
541 context of the different developmental windows). Studies using the Short Moods and  
542 Feelings Questionnaire (SMFQ) depression data in ALSPAC have demonstrated this  
543 sensitivity, with different studies identifying varying numbers of latent classes based

544 on the number of time points analysed [24, 30, 67, 68]. Such fluctuations make it  
545 challenging to study the true relationships between risk factors and outcomes, as the  
546 latent groups themselves may shift depending on the study design. Whereas multi-  
547 level modelling is less sensitive to such changes in number of time points as it  
548 models trajectories on observed groups of individuals.

549 There was also strong evidence of sex specific effects of IL-6 on depression  
550 trajectories in ALSPAC and weaker evidence in UK Biobank. Previous studies have  
551 shown that females have worse depression trajectories than males in ALSPAC [29-  
552 31]. Here, in addition to showing this, sex-differences in depression trajectories were  
553 also shown to persist into older adulthood (39-86 years). This is consistent with  
554 findings in other cohorts [31]. In ALSPAC, there was evidence that the difference in  
555 depressive scores between the top third and bottom third IL-6 tertile at ages 13 and  
556 16 years was greater in females than in males. Similar findings have been reported  
557 elsewhere, showing that IL-6 associates with more severe depression in female but  
558 not male adolescents [33]. This could be due to hormonal changes that occur during  
559 pubertal development [69]. Female sex hormones, such as oestrogen have also  
560 been shown to have effects on the immune system, though depending on context  
561 can have both anti or pro-inflammatory effects [70]. However, there may also be  
562 methodological explanations for this sex difference, such as there are a greater  
563 number of females than males in ALSPAC. Whereas in UK Biobank the differences  
564 in scores between the top third and bottom third IL-6 tertile remained in both males  
565 and females for ages 40 years but occurred only in males at age 50 years and  
566 diminished at age 80 years. This could be attributed to a variety of explanations

567 including that in general inflammation increases with age [71]. In UK Biobank the  
568 ages of participants at the initial assessment when IL-6 was measured varied from  
569 age 39 to 70 years. Whereas in ALSPAC IL-6 was measured at age 9 years. This led  
570 to differences in the mean ages for UK Biobank participants for each IL-6 tertile  
571 group, with an older mean age for each tertile as IL-6 increases. However, age was  
572 included in the models. Future studies should assess the relationship of  
573 inflammatory markers measured at the same age on depression trajectories in older  
574 individuals to strengthen the findings in this current study.

575 However, extensive sensitivity analyses from both cohorts showed these findings  
576 persisted when controlling for factors that typically affect depression and  
577 inflammation. In ALSPAC, these findings were robust against adjusting for covariates  
578 sex, BMI and socioeconomic markers (maternal education or Townsend deprivation  
579 index quintiles). Sensitivity analyses removing individuals taking any medication also  
580 resulted in similar model coefficients. In UK Biobank, these findings were robust  
581 against adjusting for covariates sex, BMI, Townsend deprivation index and smoking  
582 status.

583 The UKB-PPP study was enriched for people with ill health and therefore the sample  
584 used for the UK Biobank analysis may be bias to this [51]. This was accounted for in  
585 the sensitivity analyses removing individuals with an inflammatory condition, with  
586 BMI  $\geq$  40 or who were taking anti-inflammatory medication which showed similar  
587 effects to the main analysis. In both ALSPAC and UK Biobank, using a continuous  
588 measure of IL-6 showed similar results to using IL-6 tertile groups.

589 However, it should be noted that these effect sizes are small, and the confidence  
590 intervals are wide (despite the large sample sizes). This could be due to some  
591 limitations of the study. Both ALSPAC and UK Biobank are population-based cohorts  
592 rather than clinical cohorts. Further, UK Biobank participants are more likely to be  
593 female and living in less socioeconomically deprived areas than the general  
594 population [72]. Additionally, although the age range of participants in UK Biobank is  
595 39 to 86 years, the mean participants age is between 57 and 70 years for each time  
596 point (Supplementary Table 6). This contributes to higher confidence intervals in the  
597 distal ages, and therefore results should be interpreted with this in consideration.  
598 Additionally, in UK Biobank the repeat imaging assessment had the lowest sample  
599 size across all time points assessed (N=331). This may affect the robustness of the  
600 growth curve estimation for the age range covered by this assessment. However,  
601 there is some overlap with this age range and other assessment time points with  
602 larger sample sizes (Supplementary Table 2; Supplementary Table 6). It should also  
603 be noted only one inflammatory marker, serum IL-6, was investigated in this study.  
604 This is due to previous longitudinal and MR studies finding the strongest  
605 associations between this marker and depression outcomes, even when additional  
606 inflammatory markers were investigated [9-11, 16]. However, in addition to  
607 inflammatory processes, IL-6 has other physiological roles such as tissue repair and  
608 lipolysis in the liver, which can occur in the absence of inflammation [73]. Future  
609 studies should investigate multiple markers that form inflammatory pathways to fully  
610 understand the role of inflammation in depression. This will require careful

611 consideration in incorporating statistical approaches capturing the highly correlated  
612 structure of inflammatory markers with trajectory modelling.

613 There are also other limitations to consider in this study. Both ALSPAC and UK  
614 Biobank suffer from attrition and in UK Biobank 48% only had one measurement of  
615 depressive symptoms. These individuals were retained in the analysis as they  
616 contribute to the relationship between IL-6 and depression, and a key advantage of  
617 multi-level models is that it uses FIML to account for missing outcome data.

618 However, if the data is not missing at random then this method would be biased. We  
619 conducted sensitivity tests and found that IL-6 tertile group associated with the  
620 number of times a participant completed a questionnaire associated in UK Biobank  
621 but not in ALSPAC. In UK Biobank this sensitivity analysis was done in participants  
622 that remained alive after the initial assessment, due to this cohort being an older  
623 sample, and excluded the two imaging appointments. Additionally, trajectory models  
624 with samples limited to individuals that had attended at least two assessments  
625 showed smaller effect sizes than in the main analysis in UK Biobank but not in  
626 ALSPAC. These individuals with at least two assessments also had lower IL-6 at  
627 baseline compared to individuals with only one assessment (Supplementary Figure  
628 10). This suggests that there is likely some bias between IL-6 tertile group and  
629 subsequent attrition with data not missing at random in UK Biobank, but not in  
630 ALSPAC. This is similar to findings showing healthy participation bias in UK Biobank  
631 affects downstream analyses in genetic epidemiology studies [74].

632 In conclusion, the findings in this study suggest that high IL-6 associates with worse  
633 depression symptom trajectories observed at different stages of the life course, with  
634 stronger associations in younger individuals. However, these statistically significant  
635 associations ( $p_{FDR} < 0.05$ ) have small effect sizes, which is typical of large cohort  
636 studies. On further analysis of sex differences, this association was stronger in  
637 females, compared to males in early adolescence. Whereas weaker sex differences  
638 were observed in later life. Future studies could also investigate the trajectories of  
639 different depression subtypes, such as atypical depression, and whether  
640 inflammatory proteins from a wider panel of markers influence their trajectories  
641 across the life course.

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674 **Conflict of Interest**

675 None to declare.

676 For supplementary material accompanying this paper, visit [cambridge.org/EPA](https://cambridge.org/EPA).

677 **Data availability**

678 The data used in the present study is available from UK Biobank and ALSPAC with  
679 restrictions applied. Data were used under license and thus not publicly available.

680 Access to the UK Biobank data can be requested through a standard protocol

681 (<https://www.ukbiobank.ac.uk/register-apply/>). The ALSPAC study website contains

682 details of all data available: <http://www.bristol.ac.uk/alspac/researchers/our-data>. Code

683 used for analysis is publicly available on GitHub

684 ([www.github.com/ameliaes/2025\\_EurPsych](https://www.github.com/ameliaes/2025_EurPsych)).

685

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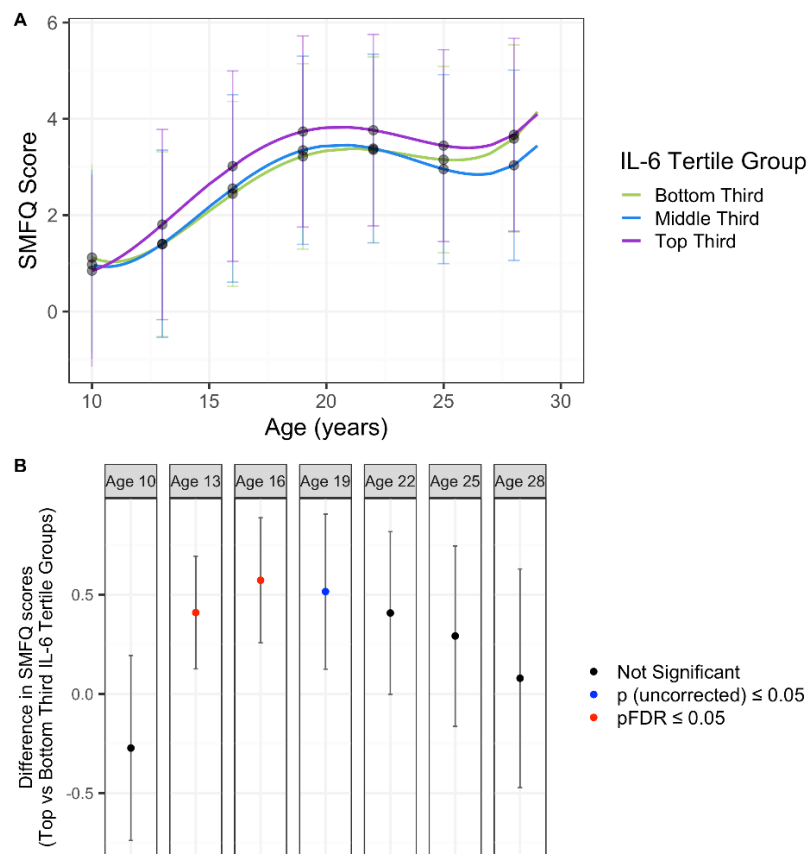
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960 **8. Figure Legends**

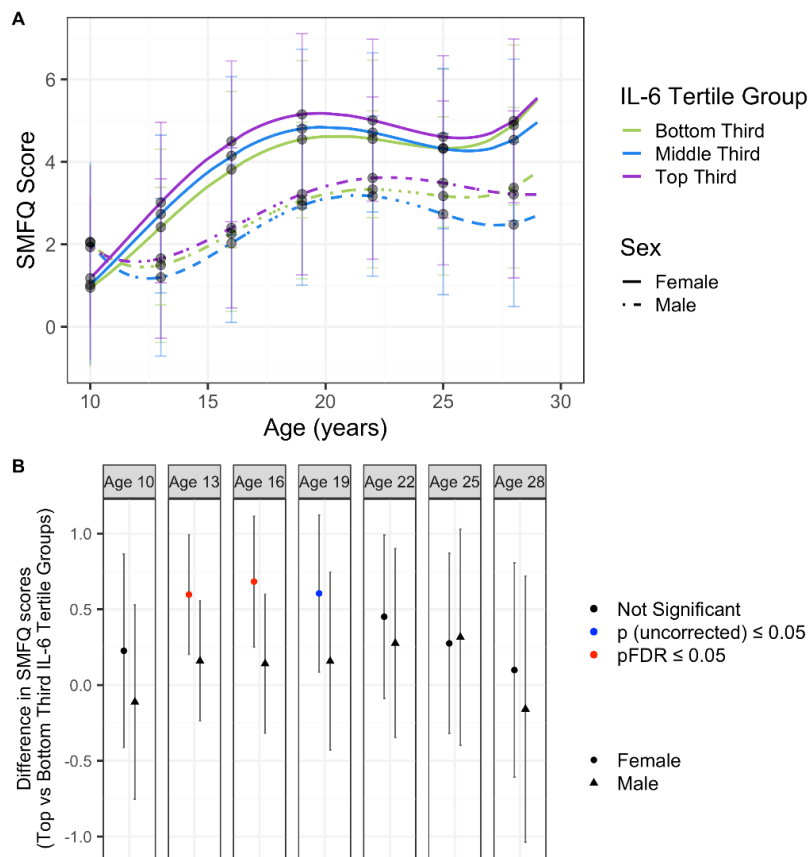
961 **Figure 1. A. Depression trajectories in ALSPAC split by IL-6 tertile groups. B.**  
 962 **Differences in depression scores in ALSPAC between top third and bottom**  
 963 **third IL-6 tertiles.** Results from the fully adjusted model. Mean depressive scores  
 964 were calculated from the depression trajectories in each IL-6 tertile at ages 10, 13,  
 965 16, 19, 22, 25 and 28 years. Differences between the top third and bottom third IL-6  
 966 tertile trajectories was calculated using the delta method. P-values are corrected for  
 967 multiple correction (FDR).



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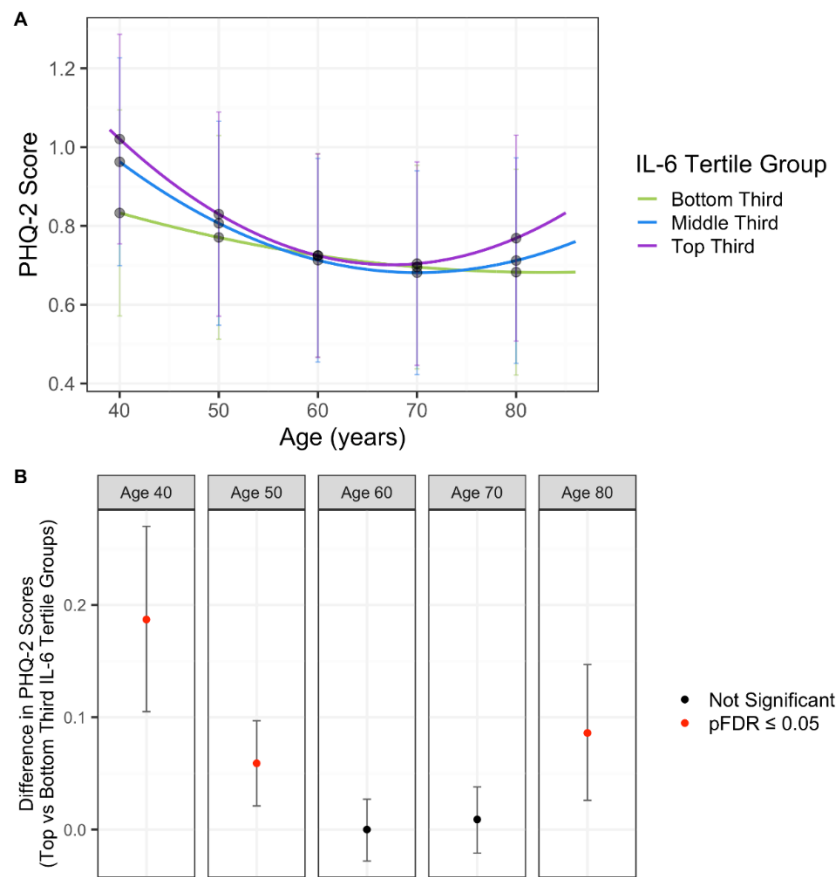
970 **Figure 2. A. Depression trajectories in ALSPAC split by sex and IL-6 tertile**  
 971 **groups. B. Differences in depression scores in ALSPAC between top third and**  
 972 **bottom third IL-6 tertiles, in males and females separately.** Results from the fully  
 973 adjusted model. Mean depressive scores were calculated from the depression  
 974 trajectories in each IL-6 tertile split by sex at ages 10, 13, 16, 19, 22, 25 and 28  
 975 years. Differences between the top third and bottom third IL-6 tertile trajectories was  
 976 calculated using the delta method. P-values are corrected for multiple correction  
 977 (FDR).



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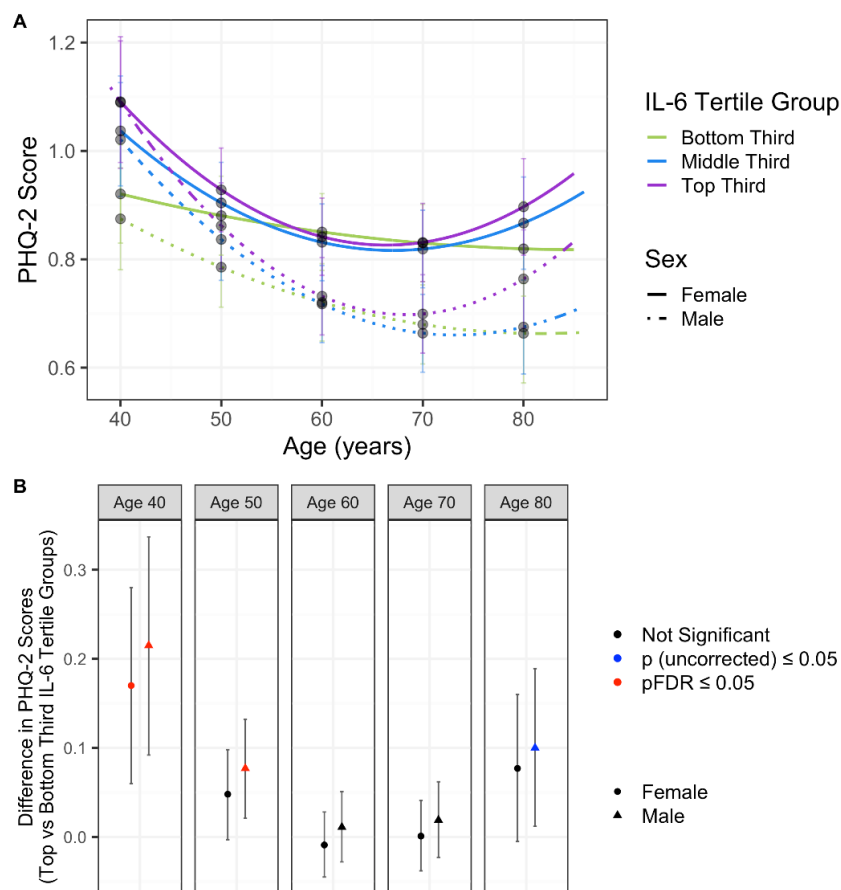
980 **Figure 3. A. Depression trajectories in UK Biobank split by IL-6 tertile groups.**  
 981 **B. Differences in depression scores in UK Biobank between top third and**  
 982 **bottom third IL-6 tertiles.** Results from the fully adjusted model. Mean depressive  
 983 scores were calculated from the depression trajectories in each IL-6 tertile at ages  
 984 40, 50, 60, 70 and 80 years. Differences between the top third and bottom third IL-6  
 985 tertile trajectories was calculated using the delta method. P-values are corrected for  
 986 multiple correction (FDR).



987

988

989 **Figure 4. A. Depression trajectories in UK Biobank split by sex and IL-6 tertile**  
 990 **groups. B. Differences in depression scores in UK Biobank between top third**  
 991 **and bottom third IL-6 tertiles, in males and females separately.** Results from the  
 992 fully adjusted model. Mean depressive scores were calculated from the depression  
 993 trajectories in each IL-6 tertile split by sex at ages 40, 50, 60, 70 and 80 years.  
 994 Differences between the top third and bottom third IL-6 tertile trajectories was  
 995 calculated using the delta method. P-values are corrected for multiple correction  
 996 (FDR).



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998

999 **Table 1. Demographic table of ALSPAC participants.**

	IL-6 Tertile Group		
	Bottom Third	Middle Third	Top Third
n	1616	1602	1617
Sex = Males (%)	943 ( 58.4)	807 ( 50.4)	666 ( 41.2)
BMI (log transformed) (mean (SD))	2.81 (0.11)	2.85 (0.14)	2.90 (0.17)
Maternal education at birth (%)			
A-level/Degree	710 ( 43.9)	646 ( 40.3)	636 ( 39.3)
CSE/O-level/Vocational	753 ( 46.6)	789 ( 49.3)	780 ( 48.2)
NA	153 ( 9.5)	167 ( 10.4)	201 ( 12.4)
Currently taking any medication (%)			
FALSE	1426 ( 88.2)	1373 ( 85.7)	1341 ( 82.9)
TRUE	187 ( 11.6)	227 ( 14.2)	272 ( 16.8)
NA	3 ( 0.2)	2 ( 0.1)	4 ( 0.2)
Townsend Deprivation Index quintile (%)			
1	478 ( 29.6)	399 ( 24.9)	399 ( 24.7)
2	219 ( 13.6)	207 ( 12.9)	198 ( 12.2)
3	245 ( 15.2)	219 ( 13.7)	235 ( 14.5)
4	222 ( 13.7)	261 ( 16.3)	271 ( 16.8)
5	74 ( 4.6)	93 ( 5.8)	95 ( 5.9)
NA	378 ( 23.4)	423 ( 26.4)	419 ( 25.9)
IL-6 (Inverse Normal Transformed, Z-score) (mean (SD))	-1.09 (0.53)	0.00 (0.25)	1.09 (0.53)
IL-6 (raw value, pg/ml)	0.39 (0.13)	0.82 (0.15)	2.48 (1.95)
SMFQ (Time Point 1) (mean (SD))	3.87 (3.32)	3.96 (3.50)	4.10 (3.55)

SMFQ (Time Point 2) (mean (SD))	3.79 (3.75)	3.71 (3.56)	4.26 (4.04)
SMFQ (Time Point 3) (mean (SD))	4.46 (4.02)	4.73 (4.42)	5.38 (4.74)
SMFQ (Time Point 4) (mean (SD))	5.38 (5.23)	5.54 (5.43)	6.32 (5.89)
SMFQ (Time Point 5) (mean (SD))	5.99 (4.90)	6.56 (5.41)	6.87 (5.40)
SMFQ (Time Point 6) (mean (SD))	6.12 (5.39)	6.19 (5.54)	7.36 (6.21)
SMFQ (Time Point 7) (mean (SD))	5.09 (4.78)	5.26 (5.26)	5.68 (5.49)
SMFQ (Time Point 8) (mean (SD))	5.76 (5.13)	5.79 (5.25)	6.25 (5.58)
SMFQ (Time Point 9) (mean (SD))	6.51 (5.74)	6.27 (5.57)	6.99 (6.01)
SMFQ (Time Point 10) (mean (SD))	6.19 (5.97)	6.24 (5.97)	7.12 (6.60)
SMFQ (Time Point 11) (mean (SD))	6.43 (5.89)	6.01 (5.72)	7.01 (6.27)
Age (Time Point 1) (mean (SD))	10.62 (0.24)	10.64 (0.25)	10.63 (0.24)
Age (Time Point 2) (mean (SD))	12.81 (0.22)	12.80 (0.22)	12.80 (0.21)
Age (Time Point 3) (mean (SD))	13.82 (0.19)	13.83 (0.21)	13.83 (0.21)
Age (Time Point 4) (mean (SD))	16.69 (0.24)	16.68 (0.25)	16.68 (0.23)
Age (Time Point 5) (mean (SD))	17.79 (0.38)	17.83 (0.39)	17.83 (0.39)
Age (Time Point 6) (mean (SD))	18.66 (0.48)	18.67 (0.49)	18.64 (0.49)
Age (Time Point 7) (mean (SD))	21.96 (0.50)	21.95 (0.53)	21.96 (0.51)
Age (Time Point 8) (mean (SD))	22.88 (0.49)	22.90 (0.53)	22.90 (0.52)
Age (Time Point 9) (mean (SD))	23.88 (0.48)	23.88 (0.53)	23.86 (0.51)
Age (Time Point 10) (mean (SD))	25.78 (0.48)	25.77 (0.52)	25.76 (0.51)
Age (Time Point 11) (mean (SD))	28.38 (0.52)	28.38 (0.54)	28.37 (0.53)

1001 **Table 2. Demographic table of UK Biobank participants.**

	IL-6 Tertile Group		
	Bottom Third	Middle Third	Top Third
n	13776	13640	12197
Sex = Male (%)	6162 ( 44.7)	6291 ( 46.1)	5737 ( 47.0)
BMI (log transformed) (mean (SD))	3.22 (0.13)	3.30 (0.14)	3.37 (0.17)
BMI (categorised) (%)			
Underweight	105 ( 0.8)	50 ( 0.4)	36 ( 0.3)
Healthy	6894 ( 50.0)	4033 ( 29.6)	2291 ( 18.8)
Overweight	5507 ( 40.0)	6563 ( 48.1)	4979 ( 40.8)
Obese	1216 ( 8.8)	2856 ( 20.9)	4351 ( 35.7)
Morbidly Obese	18 ( 0.1)	98 ( 0.7)	461 ( 3.8)
Missing	36 ( 0.3)	40 ( 0.3)	79 ( 0.6)
Inflammatory condition = TRUE (%)	1573 ( 11.4)	2095 ( 15.4)	2674 ( 21.9)
Taking inflammatory medication = TRUE (%)	3138 ( 22.8)	3692 ( 27.1)	3822 ( 31.3)
Smoking status (%)			
Previous	4412 ( 32.0)	4780 ( 35.0)	4477 ( 36.7)
Current	1196 ( 8.7)	1352 ( 9.9)	1612 ( 13.2)
Never	8124 ( 59.0)	7470 ( 54.8)	6060 ( 49.7)
NA	44 ( 0.3)	38 ( 0.3)	48 ( 0.4)
Townsend Deprivation Index (mean (SD))	-1.56 (2.99)	-1.33 (3.07)	-0.90 (3.27)
IL-6 (Inverse Normal Transformed, Z-score) (mean (SD))	-1.09 (0.53)	0.00 (0.25)	1.04 (0.50)
IL-6 (raw value, Olink Normalised) (mean (SD))	-0.70 (0.30)	-0.01 (0.17)	0.97 (0.77)

PHQ-2 (Initial time point) (mean (SD))	0.53 (1.03)	0.56 (1.08)	0.63 (1.16)
PHQ-2 (Repeat time point) (mean (SD))	0.46 (0.96)	0.41 (0.86)	0.45 (1.00)
PHQ-2 (Imaging time point) (mean (SD))	0.41 (0.96)	0.43 (0.97)	0.45 (0.95)
PHQ-2 (Repeat Imaging time point) (mean (SD))	0.32 (0.78)	0.46 (0.96)	0.39 (0.89)
PHQ-2 (Mental health time point) (mean (SD))	0.50 (1.03)	0.52 (1.06)	0.57 (1.14)
PHQ-2 (Pain time point) (mean (SD))	0.54 (1.05)	0.59 (1.12)	0.68 (1.21)
PHQ-2 (Health & Well-being time point) (mean (SD))	0.46 (1.01)	0.48 (1.06)	0.56 (1.19)
PHQ-2 (Mental well-being time point) (mean (SD))	0.52 (1.07)	0.56 (1.12)	0.64 (1.22)
Age (Initial time point) (mean (SD))	54.31 (8.13)	57.30 (7.94)	58.53 (7.60)
Age (Repeat time point) (mean (SD))	60.05 (7.38)	61.87 (7.11)	62.96 (6.61)
Age (Imaging time point) (mean (SD))	63.34 (7.82)	65.78 (7.69)	66.00 (7.61)
Age (Repeat Imaging time point) (mean (SD))	63.84 (7.40)	66.71 (7.37)	65.32 (6.76)
Age (Mental health time point) (mean (SD))	62.25 (7.84)	64.77 (7.63)	65.67 (7.33)
Age (Pain time point) (mean (SD))	64.96 (7.75)	67.66 (7.57)	68.35 (7.31)
Age (Health & Well-being time point) (mean (SD))	67.78 (7.64)	70.26 (7.47)	70.93 (7.28)
Age (Mental well-being time point) (mean (SD))	67.98 (7.54)	70.40 (7.42)	71.07 (7.22)



1003 **Table 3. Estimated differences in depression scores between IL-6 tertile top**  
 1004 **and bottom third trajectories at ages 10, 13, 16, 19, 22, 25 and 28 years, in**  
 1005 **ALSPAC. Results from the fully adjusted model.**

Age (years)	Difference (raw score)	Difference (Z- score)	95% CI	P (uncorrected)	P (FDR)
IL6 tertile: Top vs Bottom - age 10	-0.273	-0.014	-0.739 - 0.194	0.2522	1
IL6 tertile: Top vs Bottom - age 13	0.41	0.035	0.126 - 0.694	0.0047	0.0327
IL6 tertile: Top vs Bottom - age 16	0.573	0.045	0.258 - 0.888	0.0004	0.0025
IL6 tertile: Top vs Bottom - age 19	0.516	0.032	0.125 - 0.906	0.0097	0.0679
IL6 tertile: Top vs Bottom - age 22	0.408	0.024	-0.002 - 0.818	0.0511	0.3577
IL6 tertile: Top vs Bottom - age 25	0.292	0.016	-0.163 - 0.746	0.2086	1
IL6 tertile: Top vs Bottom - age 28	0.079	0.004	-0.472 - 0.63	0.7795	1

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1007 **Table 4. Estimated differences in depression scores between IL-6 tertile top**  
 1008 **and bottom third trajectories at ages 10, 13, 16, 19, 22, 25 and 28 years, in**  
 1009 **ALSPAC, split by sex. Results from the fully adjusted model.**

Age (years)	Difference (raw score)	Difference (Z-score)	95% CI	P (uncorrected)	P (FDR)
IL6 tertile: Female_Top vs Female_Bottom - age 10	0.226	0.009	-0.411 - 0.864	0.4864	1
IL6 tertile: Female_Top vs Female_Bottom - age 13	0.597	0.037	0.202 - 0.992	0.003	0.0213
IL6 tertile: Female_Top vs Female_Bottom - age 16	0.683	0.039	0.251 - 1.114	0.0019	0.0135
IL6 tertile: Female_Top vs Female_Bottom - age 19	0.605	0.029	0.086 - 1.123	0.0224	0.1565
IL6 tertile: Female_Top vs Female_Bottom - age 22	0.451	0.02	-0.089 - 0.99	0.1015	0.7106
IL6 tertile: Female_Top vs Female_Bottom - age 25	0.275	0.011	-0.321 - 0.871	0.3652	1
IL6 tertile: Female_Top vs Female_Bottom - age 28	0.099	0.003	-0.608 - 0.806	0.7836	1
IL6 tertile: Male_Top vs Male_Bottom - age 10	-0.112	-0.004	-0.754 - 0.529	0.7313	1

IL6 tertile: Male_Top vs Male_Bottom - age 13	0.159	0.01	-0.237 - 0.555	0.4319	1
IL6 tertile: Male_Top vs Male_Bottom - age 16	0.141	0.008	-0.317 - 0.6	0.5455	1
IL6 tertile: Male_Top vs Male_Bottom - age 19	0.157	0.007	-0.429 - 0.743	0.5988	1
IL6 tertile: Male_Top vs Male_Bottom - age 22	0.276	0.011	-0.347 - 0.9	0.3845	1
IL6 tertile: Male_Top vs Male_Bottom - age 25	0.316	0.011	-0.397 - 1.029	0.385	1
IL6 tertile: Male_Top vs Male_Bottom - age 28	-0.159	-0.004	-1.038 - 0.72	0.7226	1

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1012 **Table 5. Estimated differences in depression scores between different IL-6**  
 1013 **tertile trajectories at ages 40, 50, 60, 70 and 80 years, in UK Biobank. Results**  
 1014 from the fully adjusted model.

Age (years)	Difference (raw score)	Difference (Z-score)	95% CI	P (uncorrected)	P (FDR)
IL6 tertile: Top vs Bottom - age 40	0.187	0.018	0.105 - 0.27	p<0.0001	p<0.0001
IL6 tertile: Top vs Bottom - age 50	0.059	0.013	0.021 - 0.097	0.0022	0.0111
IL6 tertile: Top vs Bottom - age 60	0	0	-0.028 - 0.027	0.9728	1
IL6 tertile: Top vs Bottom - age 70	0.009	0.002	-0.021 - 0.038	0.5692	1
IL6 tertile: Top vs Bottom - age 80	0.086	0.011	0.026 - 0.147	0.0051	0.0257

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1016 **Table 6. Estimated differences in depression scores between different IL-6**  
 1017 **tertile trajectories at ages 40, 50, 60, 70 and 80 years, in UK Biobank, split by**  
 1018 **sex. Results from the fully adjusted model.**

Age (years)	Difference (raw score)	Difference (Z-score)	95% CI	P (uncorrected )	P (FDR)
IL6 tertile: Female_Top vs Female_Bottom - age 40	0.17	0.012	0.06 - 0.28	0.0025	0.0124
IL6 tertile: Female_Top vs Female_Bottom - age 50	0.048	0.008	-0.003 - 0.098	0.0651	0.3257
IL6 tertile: Female_Top vs Female_Bottom - age 60	-0.009	-0.002	-0.045 - 0.028	0.6358	1
IL6 tertile: Female_Top vs Female_Bottom - age 70	0.001	0	-0.038 - 0.041	0.9536	1
IL6 tertile: Female_Top vs Female_Bottom - age 80	0.077	0.008	-0.005 - 0.16	0.0651	0.3253

IL6 tertile: Male_Top vs Male_Bottom - age 40	0.215	0.014	0.092 - 0.337	0.0006	0.0029
IL6 tertile: Male_Top vs Male_Bottom - age 50	0.077	0.011	0.021 - 0.132	0.0067	0.0335
IL6 tertile: Male_Top vs Male_Bottom - age 60	0.011	0.002	-0.028 - 0.051	0.5675	1
IL6 tertile: Male_Top vs Male_Bottom - age 70	0.019	0.004	-0.023 - 0.062	0.3687	1
IL6 tertile: Male_Top vs Male_Bottom - age 80	0.1	0.009	0.012 - 0.189	0.0256	0.128