

1 **Lifetime Sunburn Trajectories and Risk of Cutaneous Melanoma and Squamous Cell**
2 **Carcinoma**

3 Simon Lergenmuller*, PhD; Corina S. Rueegg*, PhD; Flavie Perrier, PhD; Trude E.
4 Robsahm, PhD; Adele C. Green, PhD; Eiliv Lund, PhD; Reza Ghiasvand, PhD; Marit
5 B.Veierød, PhD.

6 *shared first author

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8 **Author Affiliations:**

9 Oslo Centre for Biostatistics and Epidemiology, Department of Biostatistics, Institute of
10 Basic Medical Sciences, University of Oslo, Oslo, Norway (Simon Lergenmuller, Flavie
11 Perrier, Marit B. Veierød); Department of Research, Institute of Population-Based Cancer
12 Research, Cancer Registry of Norway, Oslo, Norway (Reza Ghiasvand, Trude E. Robsahm,
13 Eiliv Lund); Oslo Centre for Biostatistics and Epidemiology, Oslo University Hospital, Oslo,
14 Norway (Reza Ghiasvand, Corina S. Rueegg); Population Health Department, QIMR
15 Berghofer Medical Research Institute, Brisbane, Australia (Adele C. Green); Cancer
16 Research UK Manchester and Faculty of Biology, Medicine and Health, University of
17 Manchester, Manchester, United Kingdom (Adele C. Green); Department of Public Health,
18 Faculty of Health Sciences, University of Tromsø, Tromsø, Norway (Eiliv Lund).

19 **Corresponding author:**

20 Simon Lergenmuller

21 Oslo Centre for Biostatistics and Epidemiology, Department of Biostatistics, Institute of
22 Basic Medical Sciences, University of Oslo, P.O. Box 1122 Blindern, 0317 Oslo, Norway
23 e-mail: simon.lergenmuller@medisin.uio.no

24 Phone: +47 968 53 713

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26 **Key Points (99/100 words)**

27 **Question:** What are the lifetime trajectories of sunburns among Norwegian women, and how
28 do these relate to subsequent risk of cutaneous melanoma and squamous cell carcinoma?

29 **Findings:** In this prospective cohort study, we identified five classes of lifetime sunburn
30 trajectories, in line with health behaviors generally observed in people. We found that
31 trajectories with high sunburn frequencies in childhood and throughout life increased both
32 melanoma and cSCC risks in Norwegian women.

33 **Meaning:** Lifetime trajectories of sunburns were identified for the first time, and the findings
34 provide supporting evidence that avoiding sunburns throughout life, in particular in
35 childhood, is crucial.

36 **ABSTRACT (345/350 words)**

37 **Importance:** No study has prospectively investigated sunburn patterns over age periods from
38 childhood to adulthood, and their associations with skin cancer risk.

39 **Objective:** To identify lifetime trajectories of sunburns, and compare the association between
40 these trajectories and subsequent risk of cutaneous melanoma and squamous cell carcinoma
41 (cSCC).

42 **Design:** Norwegian Women and Cancer Study, established in 1991, with follow-up through
43 2018.

44 **Setting:** Population-based cohort study

45 **Participants:** We included 168,553 women born 1927-1963. Baseline questionnaires were
46 issued 1991-2007, and follow-up questionnaires every 5-7 years.

47 **Exposures:** Participants reported pigmentation factors, sunbathing vacations and indoor
48 tanning. Annual frequencies of sunburns were reported for childhood, adolescence and
49 adulthood.

50 **Main Outcomes and Measures:** Information on cancer diagnoses, emigration and death
51 were obtained through linkage to the Cancer Registry of Norway, using the unique personal
52 identification number of Norwegian citizens.

53 **Results:** We identified five classes («stable low», «low-moderate-low», «low to high», «high
54 to low», and «stable high») of individual lifetime sunburn trajectories with similar shapes
55 when estimated in three samples aged up to 39 ($n=159,773$), up to 49 ($n=153,297$) and up to
56 59 years ($n=119,170$). Mean follow-up ranged 14.3-19.5 years in the three samples, during
57 which 1,252-1,774 women were diagnosed with incident primary melanoma and 739-871
58 with incident primary cSCC. With hazard ratios (HRs) and 95% confidence intervals (CIs)
59 estimated using Cox proportional hazards model, the «stable high» and «high to low»
60 trajectories showed significant increased melanoma and cSCC risks compared to the «stable

61 low» trajectory across all samples (HRs for trajectories up to 39 years for «stable high» and
62 «high to low»: melanoma, HR=1.50, 95%CI 1.28-1.75 and HR=1.44 95%CI 1.20-1.73;
63 cSCC, HR=1.51, 95%CI 1.22-1.87 and HR=1.47 95%CI 1.14-1.91). Other trajectories
64 showed increased risk, although generally weaker and mainly non-significant estimates. We
65 found no significant heterogeneity between melanoma and cSCC estimates.

66 **Conclusion and Relevance:** By studying for the first time lifetime trajectories of sunburns,
67 we found that high sunburn frequency throughout life increases melanoma and cSCC risk.
68 Furthermore, sunburns in childhood are especially important for subsequent risk of these skin
69 cancers. Avoiding sunburns throughout life, in particular in childhood, is therefore crucial.

70 **INTRODUCTION**

71 Cutaneous melanoma (hereafter melanoma) and cutaneous squamous cell carcinoma (cSCC)
72 continue to increase in fair-skinned populations worldwide,¹⁻³ and represent a substantial
73 burden for individuals, societies and health care systems.⁴⁻⁸

74 While sun exposure is the main environmental cause of melanoma and cSCC, the
75 relationships between sun exposure and these two cancers are complex and likely different.
76 Cutaneous SCC is mainly related to cumulative (chronic, lifetime) sun exposure,^{1,9} while both
77 cumulative and intermittent sun exposure play a role in melanoma development depending on
78 anatomic site.^{10,11}

79 Sunburn is an inflammatory response of the skin to acute sun exposure. Studies
80 comparing people migrating to low latitudes at different ages, found that childhood may be a
81 susceptible phase for the harmful effects of overexposure to the sun.¹²⁻¹⁴ During childhood,
82 melanocytes may be more susceptible to initiation of ultraviolet radiation (UVR)-induced
83 carcinogenesis through sunburns, thus increasing melanoma risk.¹⁴⁻¹⁸ In their meta-analysis,
84 Gandini et al¹⁹ found higher melanoma risk for people with sunburns in childhood than for
85 people with sunburns in adulthood, although differences between the estimates of the two
86 groups were not significant. Later, in the meta-analysis by Dennis et al,²⁰ the effect estimate
87 was highest for people with sunburns in adulthood but increased melanoma risks were also
88 found for people with sunburns in childhood and adolescence. For cSCC, increased risk has
89 been found after sunburns in childhood,²¹⁻²⁴ but not after sunburns in adulthood.^{21,22} Lifetime
90 number of sunburns is associated with both increased risk of melanoma^{19,20} and cSCC²⁵⁻²⁸.
91 Only one cohort study has investigated the association between sunburns and both melanoma
92 and cSCC risks, but timing of sunburns was not assessed.²⁷ No study has investigated
93 sunburn patterns over age periods from childhood to adulthood, and their associations with
94 melanoma and cSCC, likely because of the challenges involved.¹⁹ An individual's behavior in

95 relation to sunburn frequency in early life may affect future behavior,²⁹ including future
96 sunburn frequency, making it difficult to relate sunburns at different ages to skin cancer risk.

97 To overcome these challenges, we used latent class mixed models in the large
98 population-based Norwegian Women and Cancer (NOWAC) cohort study³⁰ to (i) identify
99 lifetime sunburn trajectories, and (ii) compare the associations between these trajectories and
100 melanoma and cSCC occurrence.

101

102 **METHODS**

103 **The NOWAC cohort**

104 In the NOWAC cohort, women were selected randomly from the Norwegian Population
105 Register, and issued a questionnaire at study inclusion in 1991-2007.^{30,31} In total, 172,472
106 women aged 31-70 years participated (response, 54%). First and second follow-up
107 questionnaires were issued approximately every five years (response 80% and 79%,
108 respectively). All women provided informed consent, and data were handled in accordance
109 with the relevant ethical regulations. The STROBE reporting guidelines were used.³² The
110 study has been approved by the Regional Committees for Medical and Health Research
111 Ethics of North Norway (2021/252094/REK Nord) and the Norwegian Centre for Research
112 Data (2021/147992).

113 **Annual number of sunburns**

114 Annual number of sunburns that resulted in pain, blistering and subsequent peeling (never, 1,
115 2-3, 4-5, ≥ 6), were recorded at study inclusion for childhood (0-9 years), adolescence (10-19
116 years), and adulthood (≥ 20 years). In follow-up questionnaires, information was updated with
117 number of sunburns since last questionnaire. Depending on the questionnaire (inclusion or
118 follow-ups) and age at inclusion, sunburn frequencies in adulthood were recorded for age

119 periods of varying lengths (range, 1-26 years), and converted into 10-year periods (20-29, 30-
120 39, 40-49 [if applicable] and 50-59 [if applicable] years).

121 **Covariates**

122 Annual number of weeks spent on sunbathing vacations in high and/or lower latitudes (never,
123 1, 2-3, 4-6, ≥ 7), and history of use of indoor tanning devices (never, rarely, 1, 2, 3-4
124 times/month, >1 time/week) were recorded for the same age periods as sunburns. We
125 calculated the cumulative number of weeks spent on sunbathing vacations^{33,34} and
126 categorized it as none, lowest, middle, or highest tertile. Use of indoor tanning devices was
127 categorized as never/ever. Residential ambient UVR exposure was categorized based on
128 mean ambient UVR hours of the region of residence³⁵ (latitudes 70°-58°) as low (northern
129 Norway), medium-low (central Norway), medium (south-western Norway), and highest
130 (south-eastern Norway).^{31,33} Participants reported the number of years of education
131 (categorized as ≤ 10 , 11-13, ≥ 14 years), smoking status (never, former, current), hair color
132 (black/dark brown, brown, blond/yellow, red), untanned skin color (color scale from 1 [very
133 fair] to 10 [very dark]; categorized as light [1-3], medium [4-5], dark [6-8], very dark [9-10]),
134 freckling when sunbathing (no, yes), and number of asymmetrical nevi >5 mm in diameter on
135 the legs (0, 1, 2-3, 4-6, 7-12, 13-24, ≥ 25 ; categorized as 0, 1, >1). Skin reactions to acute sun
136 exposure (brown without being red first, red, red with burning, red with burning and
137 blistering) and chronic sun exposure (deep brown, brown, light brown, never brown) were
138 recorded for a subsample of the cohort.

139 **Follow-up**

140 The cohort was linked to the Cancer Registry of Norway using the unique personal
141 identification number of Norwegian residents ensuring complete information on cancer
142 diagnoses and vital status (alive, emigrated, dead; before and after receiving the
143 questionnaires), with dates of diagnosis, emigration or death, until December 31, 2018.

144 Melanoma and cSCC cases were identified by the *International Classification of Diseases*,
145 *Seventh Revision* (ICD-7), codes 190.0-190.9 for melanoma and 191.0-191.9 for cSCC
146 (including the ICD-O-3 morphology codes 80703, 80713, 80763, 80953, 80513, 80723, and
147 80743). We excluded cases with code 190.5/191.4 (perineum, perianal) because they are
148 unrelated to UVR exposure. The Cancer Registry of Norway does not routinely record
149 information on basal cell carcinoma.

150 **Study sample**

151 Of the 172,472 women who returned questionnaires, 169,768 received questions about
152 sunburns at study inclusion (Figure 1). We excluded women with very dark skin (grades 9-
153 10) ($n=290$), prevalent melanoma ($n=803$) or cSCC ($n=86$), and women that emigrated or
154 died before date of questionnaire return ($n=36$), resulting in 168,553 women, born 1927-
155 1965. Due to the wide age range at inclusion (31-71 years), and in order to use the maximum
156 number of women with sunburn information available for four, five, and six age decades,
157 three samples were created: sample <40, sample <50 and sample <60. For sample <40 (used
158 for analyses of sunburn trajectories 0-39 years), we excluded women with missing sunburn
159 information in all age decades <40 years ($n=8,780$), resulting in 159,773 women. For sample
160 <50 (used for analyses of sunburn trajectories 0-49 years), we further excluded women with
161 missing sunburn information in all age decades <50 years ($n=6,476$), resulting in 153,297
162 women. For sample <60 (used for analyses of sunburn trajectories 0-59 years), we further
163 excluded women with missing sunburn information in all age decades <60 years ($n=34,127$),
164 resulting in 119,170 women.

165

166 **STATISTICAL ANALYSIS**

167 We calculated the average number of annual sunburns in each age decade by converting the
168 recorded numbers into 0, 1, 2.5, 4.5 or 7 sunburns/year, and averaging over each decade.

169 Classes of individual lifetime sunburn trajectories were then identified in each sample, using
170 a latent class mixed model (LCMM).³⁶⁻³⁸ The model assumes that the population consists of k
171 latent classes (underlying, unobserved groups of subjects) that follow class-specific sunburn
172 trajectories. The average lifetime sunburn trajectory in each class was modeled using a class-
173 specific mixed model, with median age in each decade as time scale, and average annual
174 number of sunburns in each decade as longitudinal outcome. Median age in each decade was
175 included as a second order polynomial, and a random intercept was included allowing
176 observations to be correlated in time (Supplementary Material 1).

177 The optimal number of classes of sunburn trajectories was identified based on quality
178 of model fit (Akaike/Bayesian Information Criterion, residual plots), classification power
179 (model entropy, posterior probabilities), and relevance of the trajectories (Supplementary
180 Material 1). Sankey diagrams illustrate similarities of participants' classifications across the
181 three samples (Supplementary eFigures 1-3). The association between class-membership and
182 melanoma/cSCC risk was estimated separately for melanoma and cSCC in each of the three
183 samples with hazard ratios (HRs) and 95% confidence intervals (CIs; robust variances) using
184 Cox proportional hazards models. We used age as time scale and stratified by year at
185 inclusion. We used proportional assignment to account for the classification uncertainty,
186 allowing each participant to contribute to each class weighted according to its posterior
187 probability of belonging to each class³⁹⁻⁴¹ (Supplementary Material 2). Adjustments were
188 chosen based on a directed acyclic graph^{42,43} (Supplementary eFigure 4) and included
189 residential ambient UVR exposure, hair color, freckling when sunbathing and cumulative
190 number of sunbathing vacations.

191 Start of follow-up (hereafter baseline) was age at reception of the last questionnaire
192 used to create sunburn trajectories. All trajectories were estimated before baseline, and all
193 exposure and covariate information was collected prior to cancer diagnosis. Participants

194 contributed with person-years of follow-up from baseline to first primary melanoma
195 diagnosis, cSCC diagnosis, emigration, death, or end of follow-up, whichever occurred first.
196 We censored incident cSCCs and incident melanomas in analyses of melanoma risk and
197 cSCC risk, respectively. Two pathways have been proposed for melanoma: melanomas that
198 arise primarily on intermittently or chronically sun exposed anatomic sites.¹⁰ Thus, we
199 analyzed the association between class-membership and site-specific risk of melanoma:
200 head/neck/upper limbs (ICD-7 codes 190.0, 190.2) and trunk/lower limbs (ICD-7 codes
201 190.1, 190.3, 190.4, 190.7).⁴⁴ We censored incident trunk/lower limbs melanomas in analyses
202 of head/neck/upper limbs melanoma risk, and vice versa. Heterogeneity of the HRs between
203 melanoma and cSCC, and between melanoma sites were tested using the contrast test
204 statistic.⁴⁵

205 The LCMM handles missing sunburn information when estimating trajectories.³⁷
206 When combining the other covariates, we had up to 27% missing data (up to 17% for
207 individual covariates, Table 1), and used multiple imputation with chained equations⁴⁶ to
208 impute 40 data sets.

209 We conducted several complete-case sensitivity analyses. To investigate potential
210 selection bias, we conducted analyses including prevalent melanomas and cSCCs. We used
211 alternative methods for class-allocation to account for class-membership uncertainty^{39,40,47}
212 (Supplementary Material 2). Finally, we also conducted all analyses based on an alternative
213 LCMM. For further details, and additional sensitivity analyses, see Supplementary Material
214 3. All tests were 2-sided and deemed to be significant at $P < 0.05$. Statistical analyses were
215 conducted using R version 3.6.1, and the lcmm package version 1.9.2.

216

217 **RESULTS**

218 Mean (SD) age at baseline was 49 (8.4) years for the 159,773 women in sample <40, 51 (6.1)
219 years for the 153,297 women in sample <50 and 56 (3.9) years for the 119,170 women in
220 sample <60 (Table 1). Respectively, in sample <40, sample <50 and sample <60, 1,774,
221 1,678 and 1,252 women were diagnosed with incident primary melanoma and 871, 854 and
222 739 with incident primary cSCC during a mean (SD) follow-up of 19.5 (6.5) years, 17.5 (5.5)
223 years, and 14.3 (4.2) years. Participants in sample <60 were recruited later and less likely to
224 never have been on sunbathing vacations; all other characteristics were similar in the three
225 samples.

226 **Lifetime sunburn trajectories**

227 The best model identified five classes of sunburn trajectories from 0-39 years (sample <40):
228 «stable low» (16.6%), «low-moderate-low» (8.3%), «low to high» (16.6%), «high to low»
229 (13.8%), and «stable high» (44.7%) (Figure 2). Women in the «stable low» trajectory were
230 more likely to be from northern Norway, less educated and current smokers, have darker hair
231 and skin color, no freckles, and sunbathe less (Supplementary eTable 1). In contrast, women
232 in the «stable high» trajectory were more likely to have lighter hair color, and more severe
233 skin reactions to acute sun exposure.

234 The best model identified five classes of sunburn trajectories from 0-49 years (sample
235 <50; Supplementary eFigure 5) and 0-59 years (sample <60; Figure 3), labelled as in sample
236 <40 (Figure 2). Trajectories in sample <60 were somewhat different from those in samples
237 <40 and <50, in particular the «low-moderate-low» trajectory, which started at a higher level
238 and included a higher proportion of participants. Participant characteristics in samples <50
239 and <60 were distributed similarly as in sample <40 (Supplementary eTables 2 and 3).

240 The Sankey diagrams (Supplementary eFigures 1-3) showed that «low-moderate-low»
241 trajectory was the class with the most dissimilarities across the samples. Posterior

242 probabilities of belonging to this class were in general lower than for the other classes
243 (Supplementary Material 1).

244 **Sunburn trajectories and skin cancer risk**

245 Complete-case and multiple imputation analyses showed similar results, we therefore present
246 results from multiple imputation analyses. Compared to «stable low», we found significant
247 increased melanoma and cSCC risks for «stable high» and «high to low» trajectories. HRs
248 were similar across samples, but strongest for sample <40 («stable high» versus «stable low»
249 melanoma: HR=1.50, 95%CI 1.28-1.75; cSCC: HR=1.51, 95%CI 1.22-1.87; «high to low»
250 versus «stable low» melanoma: HR=1.44, 95%CI 1.20-1.73; cSCC: HR=1.47, 95%CI 1.14-
251 1.91). In general, compared to «stable low», no significant increased skin cancer risk was
252 found for «low to high» or «low-moderate-low» trajectories, except for «low-moderate-low»
253 in sample <60 (melanoma: HR=1.29, 95%CI 1.07-1.54, cSCC: HR=1.46, 95%CI 1.17-1.83).
254 In all samples, and for all trajectories, effect estimates did not differ significantly between
255 melanoma and cSCC ($0.39 \leq P_{heterogeneity} \leq 0.95$, Table 2).

256 Melanoma site specific analyses gave similar results as the overall analysis, and effect
257 estimates did not differ significantly between sites ($0.13 \leq P_{heterogeneity} \leq 0.99$, Supplementary
258 eTable 4).

259 Sensitivity analyses including prevalent melanomas and cSCCs, and analyses using
260 alternative methods for class allocation (Supplementary eTables 5-7) gave similar results.
261 Analyses using the alternative LCMM identified somewhat different trajectories, but with
262 similar results for the associations between these trajectories and skin cancer risk
263 (Supplementary eFigure 6 and eTable 8).

264

265 **DISCUSSION**

266 In this large, prospective cohort study of Norwegian women, we identified five classes of
267 lifetime sunburn trajectories, with similar shapes when estimated over four (0-39 years), five
268 (0-49 years) or six (0-59 years) decades. Women with high number of sunburns throughout
269 life («stable high» trajectory) and high numbers in childhood but low in adulthood («high to
270 low» trajectory) showed significant increased melanoma and cSCC risks compared to women
271 with low numbers throughout life («stable low» trajectory). Low number of sunburns in
272 childhood and high in adulthood («low to high» trajectory) increased melanoma and cSCC
273 risk, although non-significantly. Finally, women with «low-moderate-low» sunburn-
274 trajectory showed non-significant increased melanoma and cSCC risk when estimated over
275 four and five decades and significantly increased risk when estimated over six decades.

276 **Lifetime sunburn trajectories**

277 To our knowledge, no previous study has yet described lifetime sunburn trajectories. The
278 identified trajectories are in line with latent clusters of health behaviors expected in a
279 population.⁴⁸⁻⁵¹ There are people who live consistently healthy or unhealthy lifestyles,
280 represented in the «stable low» and «stable high» trajectories. However, in our study, sunburn
281 frequencies not only depend on people's behavior but also on their phenotype and place of
282 living.⁵² This was confirmed by a larger proportion of women with fair complexion and sun-
283 sensitive skin in the «stable high» trajectory and with women of darker complexion and from
284 northern Norway in the «stable low» trajectory. Women with many sunburns in childhood
285 might learn from their painful experience and protect themselves more in adulthood, resulting
286 in «high to low» trajectories. Conversely, parents might protect their children from sunburns
287 in childhood but not in adolescence, a phase with lower health-seeking behaviors.⁵³ People
288 then become more health-conscious with age, leading to the «low-moderate-low»
289 trajectories,⁵⁴ and the decreasing trajectories observed when estimated over six decades.

290 **Sunburn trajectories and skin cancer risk**

291 Similar to other studies, we found no differences in the estimates between melanoma and
292 cSCC,^{24,26,27} nor between melanoma occurring on chronically sun-exposed sites
293 (head/neck/upper limbs) and intermittently sun-exposed sites (trunk/lower limbs).²⁷ Lifetime
294 number of sunburns is associated with both skin cancers and previous studies reported effect
295 estimates similar to ours for «stable high» trajectories (range melanoma: 1.52-2.27, cSCC:
296 1.40-2.40)^{19,20,25-28}. Interestingly, women with «high to low» and «stable high» trajectories
297 had similar risks of developing these skin cancers, despite a higher cumulative number of
298 sunburns in the «stable high» trajectory. These two trajectories combined correspond to
299 higher number of sunburns in childhood, and studies investigating childhood sunburns also
300 found increased skin cancer risks with similar effect estimates (range melanoma: 1.63-3.20,
301 cSCC: 1.55-2.32)^{19,20,22-24} though less precision. Women with «low to high» trajectories had
302 no significantly increased risk compared to «stable low» trajectories even though the
303 cumulative number of sunburns was more or less the same than for «high to low» trajectories.
304 Those findings support that childhood is a susceptible phase for harms from overexposure to
305 the sun¹²⁻¹⁸ and may be a driving factor for melanoma and cSCC risk in our analysis.

306 Previous studies could not confirm whether early-life sunburns increased melanoma
307 risk more than later-life sunburns.^{19,20} This might be because unlike the present study,
308 melanoma risk was compared with exposure in different periods of life separately. Early-life
309 behavior may affect later behavior, making it difficult to disentangle the direct effects on
310 disease risk of exposure in different age periods.²⁹

311 For cSCC, the literature suggests increased risk associated with sunburns in
312 childhood²¹⁻²⁴ but not in adulthood^{21,22}, in line with our findings for trajectories estimated
313 over four and five decades. However, when estimated over six decades, almost all trajectories
314 had higher cSCC risk compared to the «stable low» trajectory indicating that repeated

315 sunburns over a long period of life, represent high amounts of cumulative exposure, an
316 important cSCC risk factor.^{1,9}

317 **Limitations**

318 We have a well-characterized cohort with no major selection bias,⁵⁵ complete follow-up and
319 >99% of melanomas and cSCCs were morphologically verified.⁵⁶ Nonetheless, this study has
320 limitations. Measuring sunburn is challenging, and reproducibility studies found generally
321 lower reliability coefficients for sunburn than for other skin cancer risk factors.⁵⁷ Poor
322 measurement can result in exposure misclassification, especially for younger age decades. All
323 exposure information was collected before cancer diagnosis, thus misclassification is likely
324 non-differential, limiting the potential for recall bias. Residual confounding is inevitable in
325 observational studies. Using all information available in NOWAC, we identified potential
326 confounders based on a directed acyclic graph, and sensitivity analyses using alternative
327 adjustments yielded similar results.

328 **Conclusion**

329 We identified five latent classes of sunburn trajectories, in line with health behaviors
330 generally observed in people. By studying for the first time lifetime sunburn trajectories, we
331 found that high sunburn frequencies throughout life increased both melanoma and cSCC risks
332 in Norwegian women. Importantly, the results suggest that childhood is a more susceptible
333 phase with regard to sunburns and subsequent risk of these skin cancers. It is therefore crucial
334 to emphasize the importance of avoiding sunburns throughout life, and in particular in
335 childhood.

336

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341 **Authors' contributions:**

342 *Conception and design:* Eiliv Lund, Corina S. Rueegg, Marit B. Veierød

343 *Acquisition of data:* Eiliv Lund

344 *Analysis and interpretation of data:* all authors

345 *Drafting of the manuscript:* Simon Lergenmuller, Corina S. Rueegg

346 *Critical revision of the manuscript for important intellectual content:* all authors

347 *Statistical analysis:* Simon Lergenmuller

348 *Obtained funding:* Eiliv Lund, Marit B. Veierød

349 *Supervision:* Reza Ghiasvand, Trude E. Robsahm, Corina S. Rueegg, Marit B. Veierød

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351 The authors have no conflicts of interest to declare that are relevant to the content of this
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360 **Access to data and data analysis**

361 Simon Lergenmuller had full access to all the data in the study and takes responsibility for the
362 integrity of the data and the accuracy of the data analysis.

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502

503 **FIGURE LEGENDS**

504 **Figure 1** Selection of participants from enrolment into the study sample, Norwegian Women
505 and Cancer Study, 1991-2018; cSCC, cutaneous squamous cell carcinoma.

506 **Figure 2** Estimated average lifetime trajectories of sunburns up to 39 years (sample <40,
507 $n=159,773$). The left panel shows the estimated average trajectories of sunburn up to 39 years
508 in the five latent classes. The right panel shows the estimated average trajectory for each class
509 separately (bold line), with a sample of 500 observed individual trajectories displayed in the
510 background, picked at random among participants with highest probabilities of belonging to
511 each class. A random jitter was added to the observed trajectories in order to distinguish
512 common trajectories; no, number.

513 **Figure 3** Estimated average lifetime trajectories of sunburns up to 59 years (sample <60,
514 $n=119,170$). The left panel shows the estimated average trajectories of sunburn up to 59 years
515 in the five latent classes. The right panel shows the estimated average trajectory for each class
516 separately (bold line), with a sample of 500 observed individual trajectories displayed in the
517 background, picked at random among participants with highest probabilities of belonging to
518 each class. A random jitter was added to the observed trajectories in order to distinguish
519 common trajectories; no, number.

520

521 **Table 1.** Participant Characteristics in the Three Samples Used to Estimate Classes of
 522 Individual Lifetime Sunburn Trajectories

523

	Samples used to estimate the sunburn trajectories		
	Sample <40 ^a	Sample <50 ^b	Sample <60 ^c
No. of women	159,773	153,297	119,170
Mean (SD) age at baseline, years	49.0 (8.4)	51.3 (6.1)	56.1 (3.9)
Total person-years of follow-up	3,112,435	2,689,943	1,698,739
Mean (SD) person-years of follow-up	19.5 (6.5)	17.5 (5.5)	14.3 (4.2)
Incident melanoma cases	1,774	1,678	1,252
Mean (SD) age at melanoma diagnosis, years	61.9 (9.0)	62.7 (8.3)	65.4 (7.0)
Incident cSCC cases	871	854	739
Mean (SD) age at cSCC diagnosis, years	68.0 (9.1)	68.2 (9.0)	69.7 (8.2)
	No. (%) ^d	No. (%) ^d	No. (%) ^d
Recruitment year to the NOWAC study			
1991-1994	55,633 (34.8)	50,835 (33.2)	32,157 (27.0)
1995-1999	38,000 (23.8)	36,322 (23.7)	30,129 (25.3)
2000-2008	66,140 (41.4)	66,140 (43.1)	56,884 (47.7)
Residential ambient UVR exposure			
Low (northern Norway)	17,862 (11.2)	16,921 (11.0)	12,469 (10.5)
Medium-low (central Norway)	33,981 (21.3)	33,296 (21.7)	27,554 (23.1)
Medium (south-western Norway)	78,085 (48.9)	74,495 (48.6)	56,925 (47.8)
Highest (south-eastern Norway)	29,845 (18.7)	28,585 (18.6)	22,222 (18.6)
Education, years			
≤10	51,927 (34.2)	49,760 (34.2)	39,536 (35.1)
11-13	45,512 (29.9)	43,457 (29.8)	32,889 (29.2)
≥14	54,571 (35.9)	52,428 (36.0)	40,099 (35.6)
Missing	7,763	7,652	6,646
Smoking status at baseline			
Never	53,929 (34.2)	52,162 (34.4)	42,085 (35.7)
Former	54,959 (34.8)	53,351 (35.2)	42,647 (36.2)
Current	48,915 (31.0)	45,949 (30.3)	33,088 (28.1)
Missing	1,970	1,835	1,350
Hair color			
Black/dark brown	25,611 (17.1)	24,723 (17.0)	19,852 (17.1)
Brown	60,411 (40.3)	58,638 (40.3)	46,795 (40.2)
Blond/yellow/red	64,065 (42.7)	62,123 (42.7)	49,703 (42.7)
Missing	9,686	7,813	2,820
Untanned skin color			
Dark	27,842 (21.6)	27,834 (21.6)	22,304 (20.8)
Medium	48,814 (37.9)	48,805 (37.9)	40,554 (37.8)
Light	52,072 (40.5)	52,054 (40.4)	44,350 (41.4)
Missing	31,045	24,604	11,962
Freckling when sunbathing			
No	85,697 (64.8)	85,680 (64.8)	72,367 (65.8)
Yes	46,556 (35.2)	46,535 (35.2)	37,673 (34.2)
Missing	27,520	21,082	9,130

524 **Table 1.** Participant Characteristics in the Three Samples Used to Estimate Classes of
 525 Individual Lifetime Sunburn Trajectories (continued)
 526

	Samples used to estimate the sunburn trajectories		
	Sample <40 ^a	Sample <50 ^b	Sample <60 ^c
	No. (%) ^d	No. (%) ^d	No. (%) ^d
No. of asymmetric nevi >5mm on legs			
0	127,893 (88.2)	122,491 (88.2)	94,252 (88.1)
1	9,825 (6.8)	9,403 (6.8)	7,279 (6.8)
>1	7,230 (5.0)	6,940 (5.0)	5,430 (5.1)
Missing	14,825	14,463	12,209
Skin reaction to acute sun exposure^e			
Brown without being red first	25,456 (27.7)	23,795 (27.8)	17,320 (28.4)
Red	46,027 (50.0)	42,926 (50.2)	30,985 (50.8)
Red with burning	16,296 (17.7)	14,977 (17.5)	10,062 (16.5)
Red with burning and blistering	4,195 (4.6)	3,861 (4.5)	2,588 (4.2)
Missing	67,799	67,738	58,215
Skin reaction to chronic sun exposure^e			
Deep brown	12,410 (15.0)	11,621 (14.9)	8,373 (14.3)
Brown	47,390 (57.3)	44,757 (57.3)	33,647 (57.5)
Light brown	21,403 (25.9)	20,305 (26.0)	15,432 (26.4)
Never brown	1,500 (1.8)	1,420 (1.8)	1,086 (1.9)
Missing	77,070	75,194	60,632
Cumulative no. of weeks on sunbathing vacations			
None	16,976 (12.3)	12,145 (9.3)	6,656 (6.4)
Lowest tertile	40,659 (29.4)	40,401 (30.9)	32,283 (31.1)
Middle tertile	40,198 (29.1)	38,687 (29.6)	32,470 (31.3)
Highest tertile	40,407 (29.2)	39,674 (30.3)	32,494 (31.3)
Missing	21,533	22,390	15,267
Indoor tanning			
Never	46,258 (33.4)	41,968 (32.0)	32,864 (31.7)
Ever	92,392 (66.6)	89,044 (68.0)	70,755 (68.3)
Missing	21,123	22,285	15,551

527 Abbreviations: cSCC, cutaneous squamous cell carcinoma; no., number; NOWAC, Norwegian Women and Cancer; SD, standard deviation;
 528 UVR, ultraviolet radiation

529 ^a Sample <40: Sample used to estimate classes of individual lifetime trajectories up to 39 years. Including all women with information on
 530 sunburns in at least one age decade <40 years.

531 ^b Sample <50: Sample used to estimate classes of individual lifetime trajectories up to 49 years. Including all women from sample <40 that
 532 had information on sunburns in at least one age decade <50 years.

533 ^c Sample <60: Sample used to estimate classes of individual lifetime trajectories up to 59 years. Including all women from sample <50 that
 534 had information on sunburns in at least one age decade <60 years.

535 ^d Because of rounding, percentages may not sum up to 100%

536 ^e Recorded in subsamples of the cohort
 537
 538

539 **Table 2:** HRs (95% CI) for Classes of Lifetime Sunburn Trajectories and Risk of Melanoma and Cutaneous Squamous Cell Carcinoma

	Complete-case analyses ^a						Multiple imputation analyses ^b			
	No. of women	% ^c	Melanoma		cSCC		P for heterogeneity ^d	Melanoma	cSCC	P for heterogeneity ^d
			No. of cases	HR (95% CI)	No. of cases	HR (95% CI)		HR (95% CI)	HR (95% CI)	
Class of lifetime sunburn trajectory^e										
Sample <40: trajectories up to 39 years^f	117,352		1,293			613				
Stable low	18,191	15.5	134	1.00 [Reference]	68	1.00 [Reference]		1.00 [Reference]	1.00 [Reference]	
Low-moderate-low	10,509	9.0	76	0.98 (0.75-1.28)	32	1.06 (0.72-1.57)	0.74	1.09 (0.87-1.36)	1.21 (0.89-1.66)	0.58
Low to high	20,104	17.1	192	1.15 (0.93-1.42)	100	1.29 (0.96-1.73)	0.52	1.20 (1.00-1.43)	1.24 (0.98-1.58)	0.80
High to low	17,108	14.6	206	1.39 (1.12-1.72)	82	1.36 (0.99-1.87)	0.91	1.44 (1.20-1.73)	1.47 (1.14-1.91)	0.88
Stable high	51,440	43.8	685	1.44 (1.20-1.73)	331	1.55 (1.19-2.02)	0.66	1.50 (1.28-1.75)	1.51 (1.22-1.87)	0.95
Sample <50: trajectories up to 49 years^g	117,101		1,260			610				
Stable low	22,583	19.3	166	1.00 [Reference]	88	1.00 [Reference]		1.00 [Reference]	1.00 [Reference]	
Low-moderate-low	12,116	10.3	112	1.13 (0.90-1.41)	61	1.14 (0.84-1.55)	0.95	1.12 (0.92-1.36)	1.15 (0.89-1.49)	0.85
Low to high	15,601	13.2	135	1.07 (0.86-1.33)	70	1.19 (0.89-1.60)	0.56	1.11 (0.92-1.33)	1.14 (0.90-1.46)	0.84
High to low	24,924	21.3	304	1.39 (1.15-1.67)	150	1.45 (1.12-1.88)	0.78	1.40 (1.19-1.64)	1.48 (1.19-1.83)	0.70
Stable high	41,877	35.8	543	1.41 (1.19-1.68)	241	1.36 (1.06-1.74)	0.80	1.44 (1.24-1.67)	1.37 (1.12-1.69)	0.73
Sample <60: trajectories up to 59 years^h	96,407		992			551				
Stable low	18,735	19.4	135	1.00 [Reference]	73	1.00 [Reference]		1.00 [Reference]	1.00 [Reference]	
Low-moderate-low	19,601	20.3	198	1.21 (0.98-1.49)	136	1.60 (1.22-2.08)	0.11	1.29 (1.07-1.54)	1.46 (1.17-1.83)	0.39
Low to high	12,721	13.2	102	1.06 (0.84-1.34)	67	1.24 (0.92-1.68)	0.42	1.12 (0.91-1.37)	1.17 (0.91-1.51)	0.77
High to low	13,837	14.4	150	1.32 (1.07-1.64)	80	1.44 (1.08-1.91)	0.65	1.34 (1.10-1.62)	1.43 (1.13-1.82)	0.66
Stable high	31,513	32.7	407	1.48 (1.22-1.79)	195	1.34 (1.04-1.74)	0.55	1.50 (1.27-1.78)	1.35 (1.09-1.68)	0.46

540 Abbreviations: cSCC, cutaneous squamous cell carcinoma; CI, confidence interval; HR, hazard ratio; no., number

541 ^a Cox proportional hazards model with age as the time scale, stratified by calendar year at study inclusion and adjusted for residential ambient ultraviolet radiation exposure, hair color, freckling when sunbathing, and cumulative number of sunbathing vacations. Participants were assigned to classes using proportional assignment.

542 ^b Analyses with multiple imputation of missing data conducted using chained equations and a total of 40 imputed data sets, using the same models as in the complete-case analyses (sample <40: n=159,773 [1,774 melanoma cases, 871 cSCC cases]; sample <50: n=153,297 [1,678 melanoma cases, 854 cSCC cases]; sample <60: n=119,179 [1,252 melanoma cases, 739 cSCC cases]).

543 ^c Because of rounding, percentages may not sum up to 100%

544 ^d Heterogeneity test conducted using the contrast test statistic.

545 ^e Classes of individual lifetime trajectories estimated from a latent class mixed model. Mean annual number of sunburns was modelled using I-splines with 4 equidistant knots. Mixed model with random intercept only.

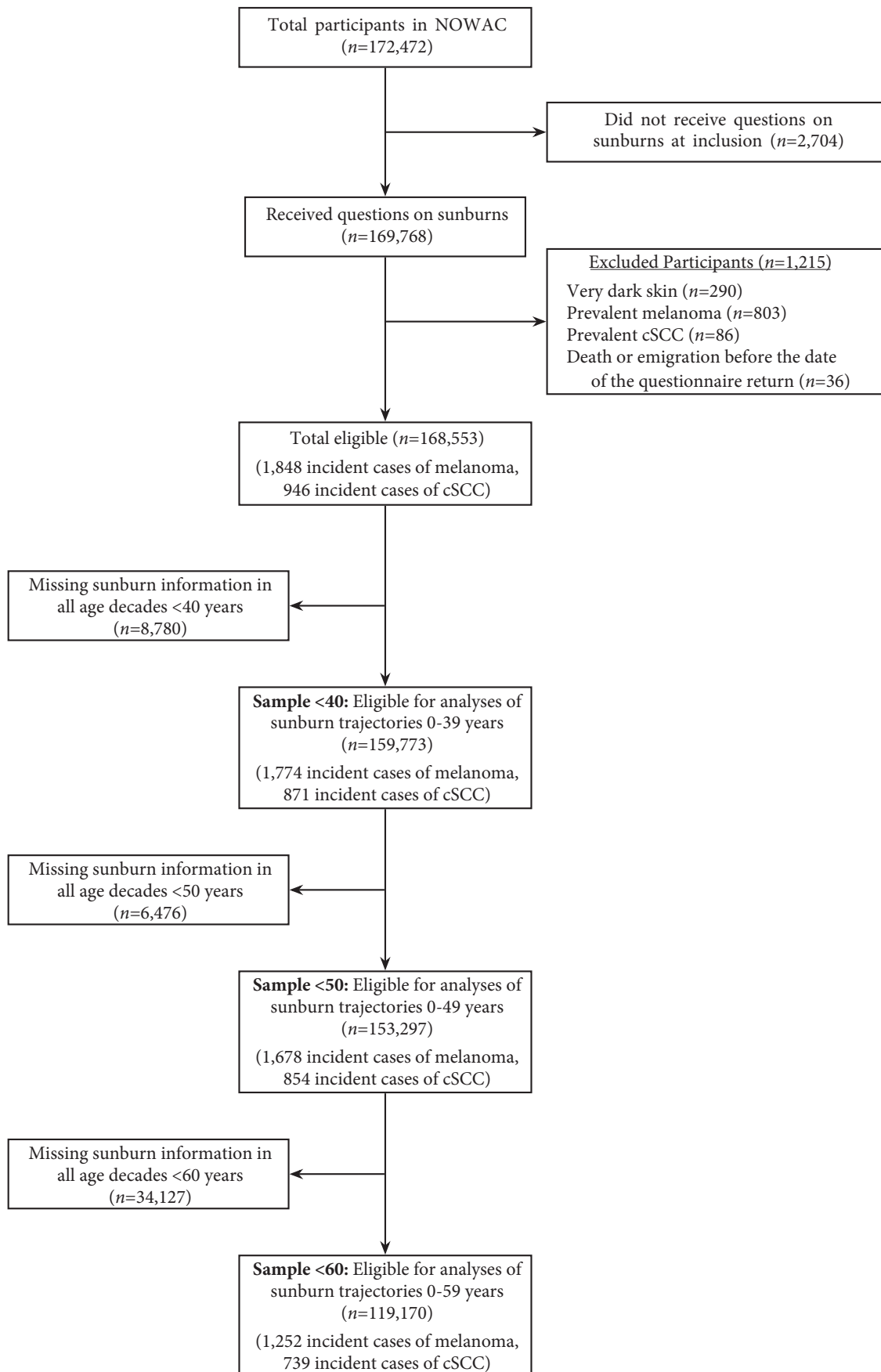
546 ^f Trajectories estimated using sunburn information up to 39 years.

547 ^g Trajectories estimated using sunburn information up to 49 years.

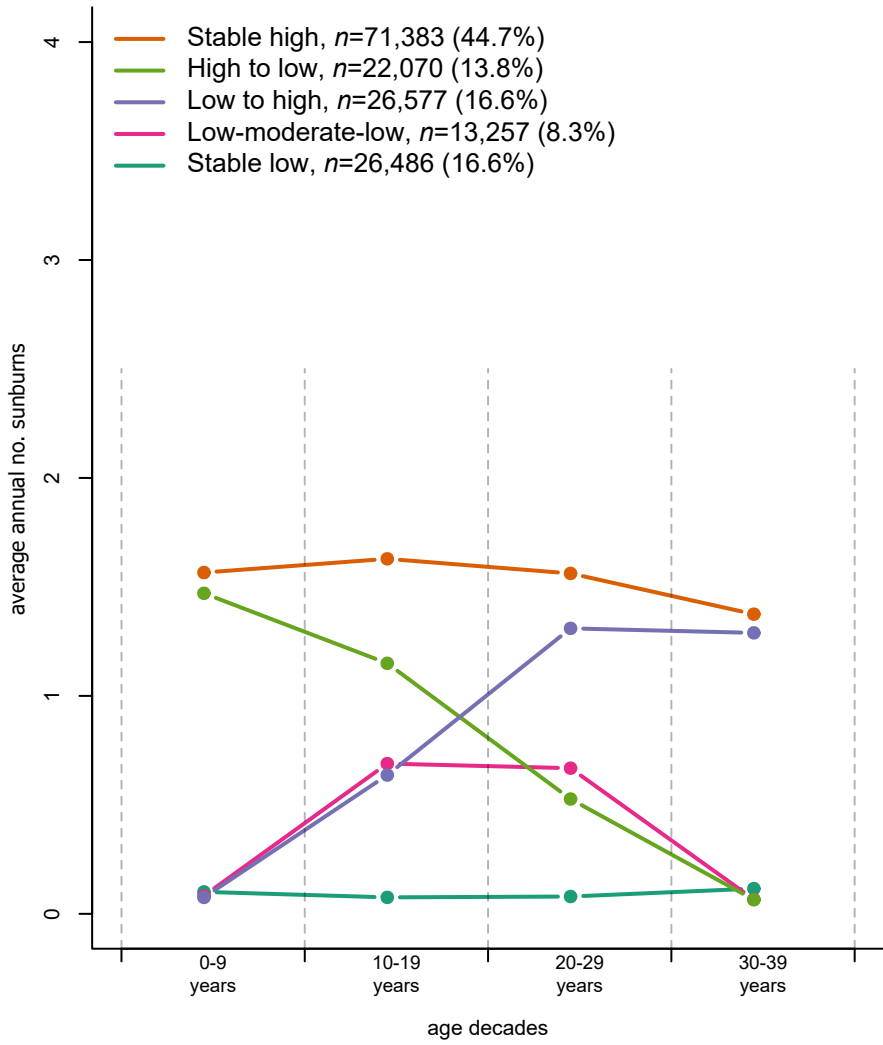
548 ^h Trajectories estimated using sunburn information up to 59 years.

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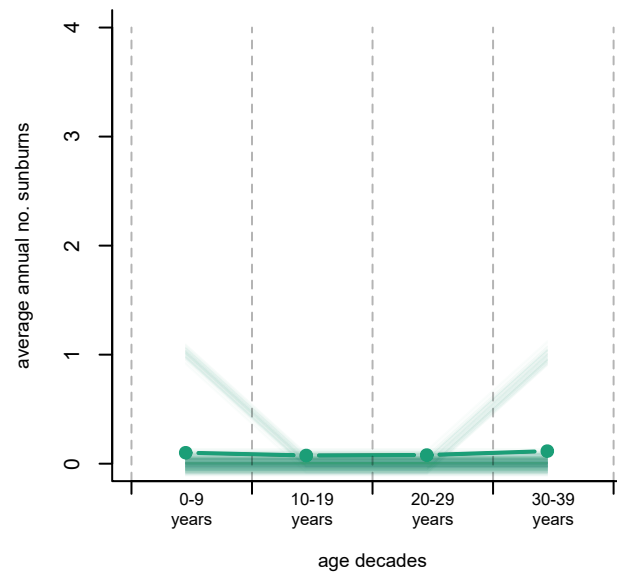
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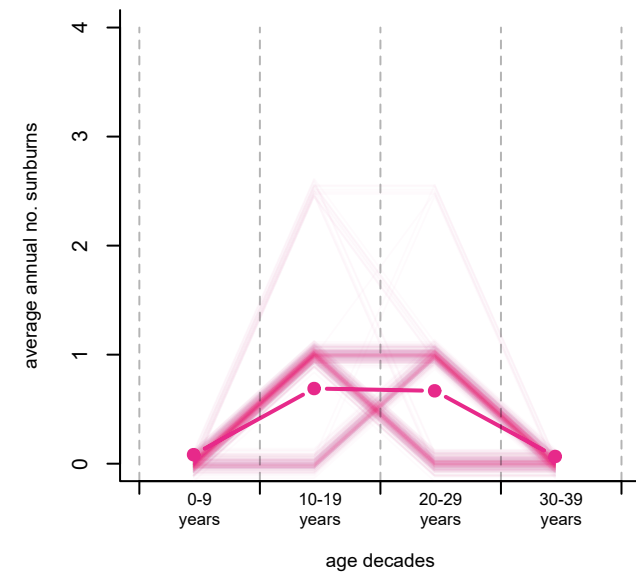
Sample <40 ($n=159,773$)



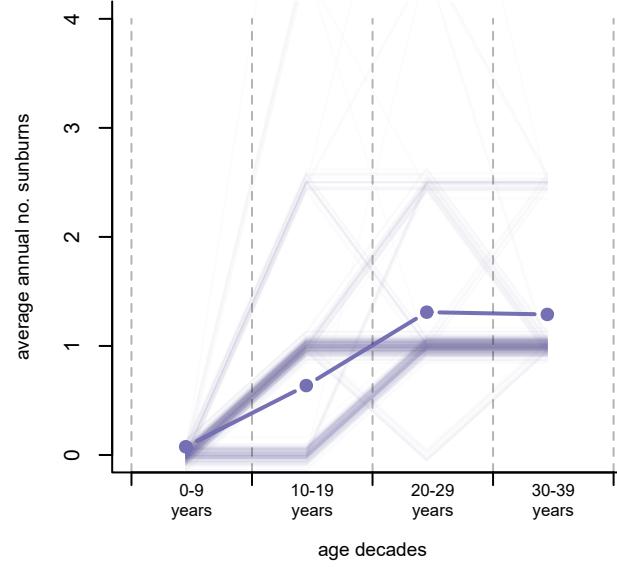
Stable low



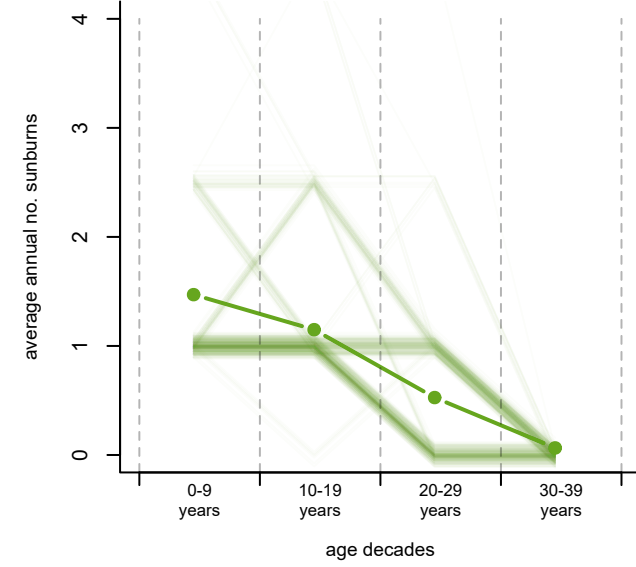
Low-moderate-low



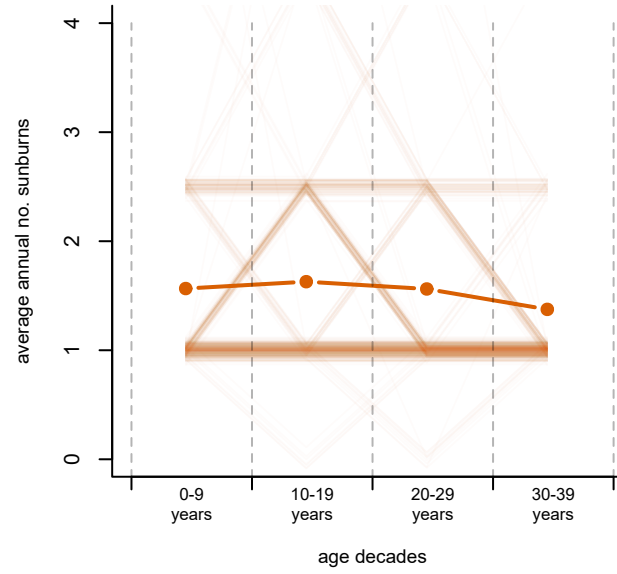
Low to high



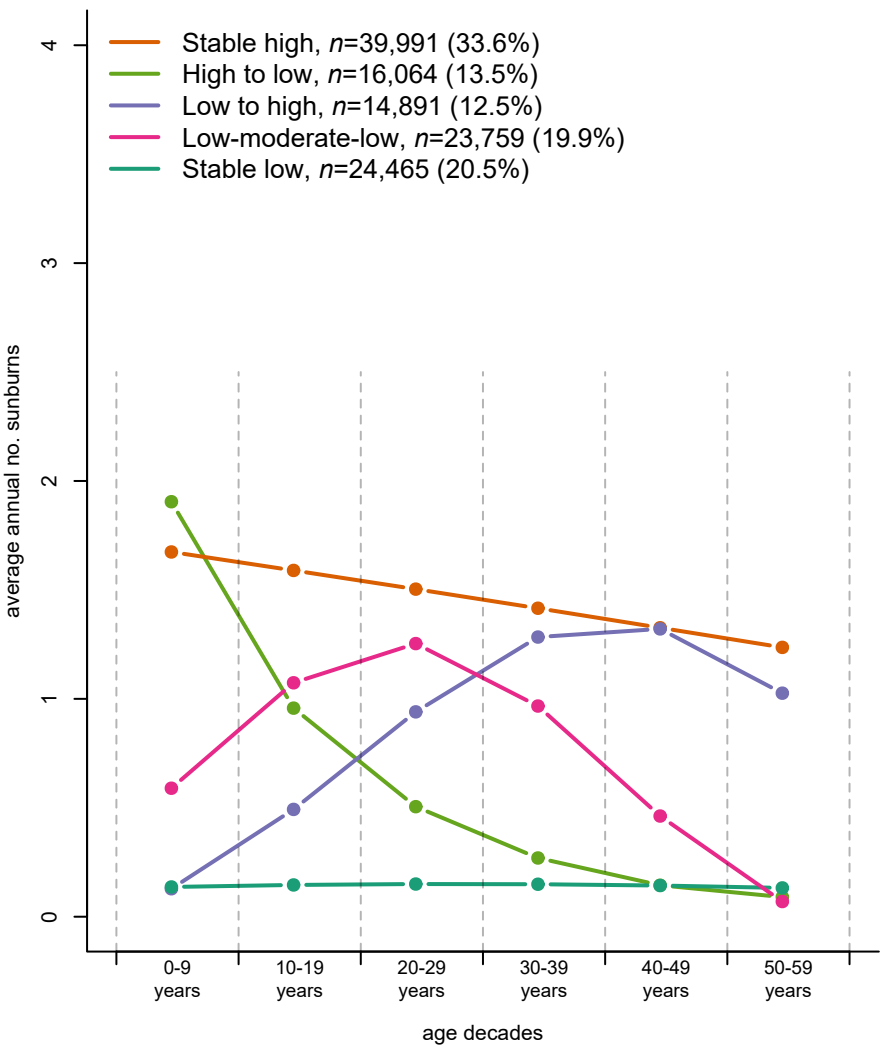
High to low



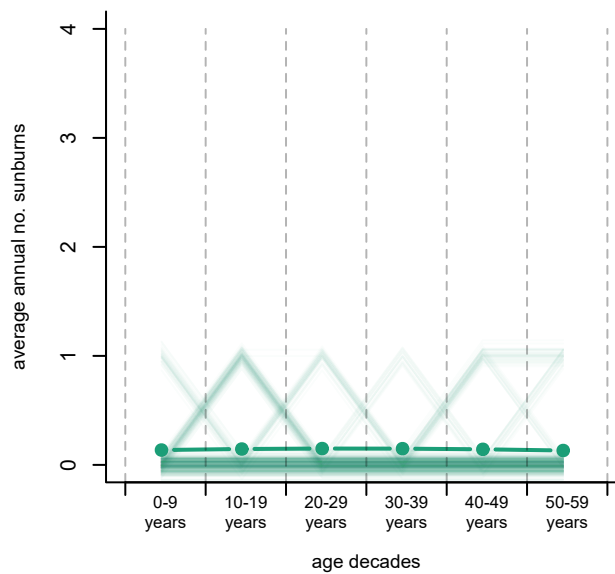
Stable high



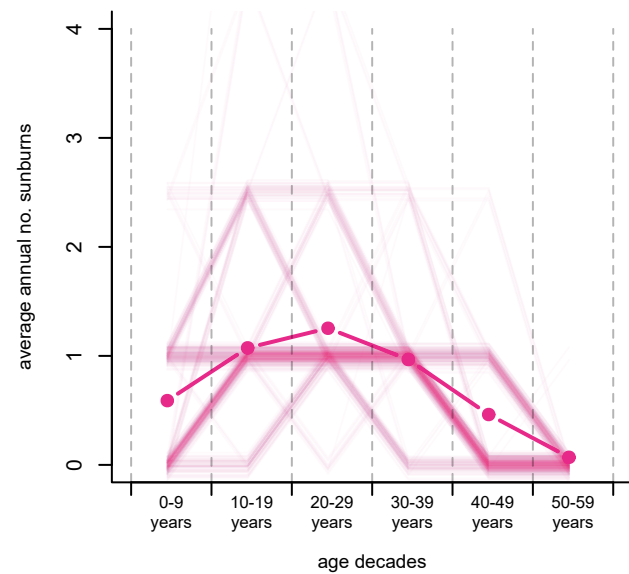
Sample <60 ($n=119,170$)



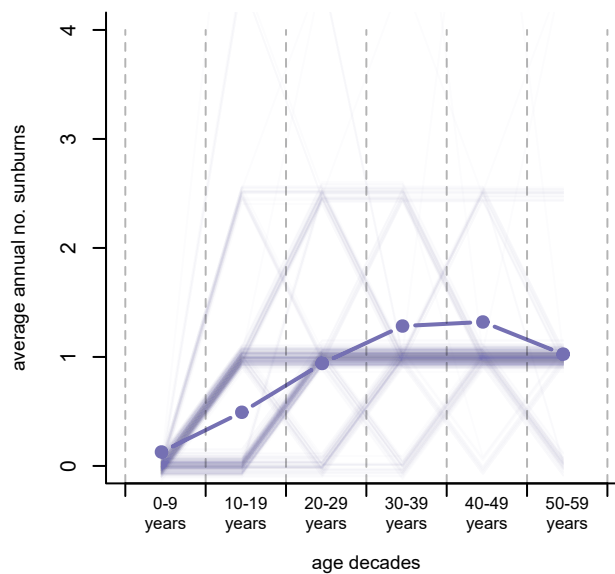
Stable low



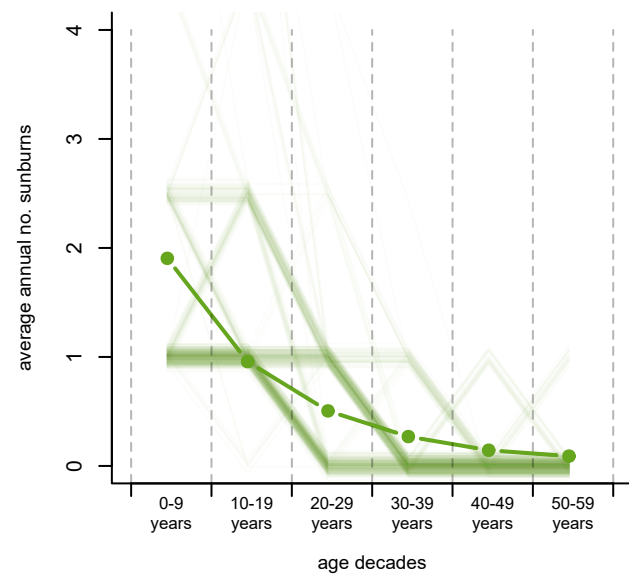
Low-moderate-low



Low to high



High to low



Stable high

