

1 Lung cancer, genetic predisposition and smoking: the Nordic Twin Study of Cancer

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33 **Key messages**

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35 What is the key question?

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37 Is there a significant genetic component to the occurrence of lung cancer and is the
38 genetic influence modified by smoking and age?

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40 What is the bottom line?

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42 The interplay between genes and tobacco smoking in the etiology of lung cancer has
43 remained controversial, and we disentangle genetic and environmental causes in cancer
44 while taking smoking status into account.

45

46 Why read on?

47

48 Our study shows that tobacco exposure causes lung cancer even when adjusting for
49 genetic factors. Interactions between genes and environmental exposure in the
50 development of lung cancer are not supported from the largest twin cohort study with
51 longest follow-up ever. Familial effects have decreased influence with increasing age.

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56 **Abstract**

57 **Background**

58 We aimed to disentangle genetic and environmental causes in lung cancer while
59 considering smoking status.

60 **Methods**

61 Four Nordic Twin Cohorts (43,512 monozygotic (MZ) and 71,895 same sex dizygotic
62 (DZ) twin individuals) had smoking data before cancer diagnosis. We used time-to-event
63 analyses accounting for censoring and competing risk of death to estimate incidence,
64 concordance risk and heritability of liability to develop lung cancer by smoking status.

65 **Results**

66 During a median of 28.5 years of follow-up we recorded 1,508 incident lung cancers. Of
67 the 30 MZ and 28 DZ pairs concordant for lung cancer, nearly all were current smokers at
68 baseline and only one concordant pair was seen among never smokers. Among ever
69 smokers the case-wise concordance of lung cancer, that is the risk before a certain age
70 conditional on lung cancer in the co-twin before that age was significantly increased
71 compared with the cumulative incidence for both MZ and DZ pairs. This ratio, the
72 relative recurrence risk, significantly decreased by age for MZ, but was constant for DZ
73 pairs. Heritability of lung cancer was 0.41 (95% CI 0.26–0.56) for currently smoking and
74 0.37 (95% CI 0.25–0.49) for ever smoking pairs. Among smoking discordant pairs, the
75 pairwise hazard ratio for lung cancer of the ever smoker twin compared to the never
76 smoker cot-win was 5.4 (95% CI 2.1–14.0) in MZ pairs and 5.0 (95% CI 3.2–7.9) in DZ
77 pairs.

78 **Conclusions**

79 The contribution of familial effects appears to decrease by age. The discordant pair
80 analysis confirms that smoking causes lung cancer.

81

82

83 **Introduction**

84 Smoking is the primary cause of lung cancer globally, though several other
85 environmental exposures play a role.¹ The estimated heritable genetic contribution to
86 variation in risk to lung cancer overall has been modest in family (heritability estimate of
87 0.08)² and twin (0.26³ and 0.18⁴) studies. Genome-wide association (GWA) studies
88 further suggest that some gene loci are associated with lung cancer in both smokers and
89 non-smokers, while other variants, such as the functional D398N (rs16969968) variant in
90 CHRNA5, are associated with lung cancer only among smokers.^{5,6} Thus, the heritability
91 of lung cancer may vary as a function of smoking, but the differential effect of smoking
92 on genetic variation underlying development of lung cancer has not been quantified.

93 To this end, our aim is to estimate the heritability of liability to lung cancer based
94 on the largest twin cohort to date, the Nordic Twin Study of Cancer (NorTwinCan)⁴,
95 which extends the Lichtenstein (2000)³ study with longer follow-up and new birth
96 cohorts and refined methodology. We sought to estimate the heritability in the liability to
97 lung cancer and whether it is modified by smoking or age.

98

99 **Methods**

100 **Material**

101 NorTwinCan includes population-based cohorts from the Danish, Finnish,
102 Norwegian, and Swedish twin registries.⁷ Each twin has an individually unique national
103 registration number, allowing for linkage to the national cancer and mortality registries
104 with complete follow-up, drop-out being only due to death or emigration. Lung cancer
105 occurrence was obtained from the national cancer registries and computed from the

106 baseline when smoking status was determined until the end of follow-up (Table 1). In all
107 cohorts, zygosity - monozygotic (MZ) or dizygotic (DZ) - was determined at baseline by
108 validated questionnaire methodology, which classifies more than 95% of twin pairs
109 correctly.³ Twins, who have not replied to the questionnaires, as well as a minority
110 providing inconsistent responses, are classified as unknown zygosity (UZ). The ethics
111 committees for each country approved the study.

112 Given the major role of smoking in the etiology of lung cancer, our analysis
113 includes twin individuals of known zygosity from the Danish, Finnish, Norwegian, and
114 Swedish registries, where data on smoking status was available prior to lung cancer
115 diagnosis. We excluded individuals from opposite-sex DZ pairs as data from them have
116 not been as comprehensively collected. For individuals who reported smoking behavior
117 on more than one questionnaire, we used the earlier information.

118 Characteristics of the four national twin cohorts included in the analyses are
119 summarized in Table 1. We classified the participants as never smokers, ever smokers
120 (former or current at time of questionnaire) and current smokers based on the survey
121 items used to assess smoking status. Smoking data in the Danish cohort came from the
122 eight questionnaire surveys conducted from 1959 to 2002.⁸⁻¹⁰ In Finland smoking data
123 came primarily from the first questionnaire survey in 1975, but some twins who had not
124 replied in 1975 responded to a questionnaire survey in 1981.^{11,12} In the Norwegian cohort
125 smoking data came from three questionnaire surveys in 1980–1982 & 1990–92 &
126 1998.^{13,14} In the Swedish cohort smoking data came from questionnaire surveys in 1961,
127 1967, 1970, and 1973.^{15,16}

128 We included individuals with histologically confirmed lung cancer. Among those
129 with smoking data, we recorded a total of 1,508 incident lung cancers with a mean
130 follow-up time of 25.2 years (21.0 years in lung cancer patients).

131

132 Statistical analysis

133 After defining cohort-specific dates of entry and follow-up, we accounted for left-
134 truncation from variable initiation of cancer registration and right-censoring among those
135 censored at the end of follow-up, and lost to follow-up due to emigration (<2%). We
136 examined the individual risk of lung cancer diagnosis by age by estimating cumulative
137 lung cancer, incidence¹⁷ and lifetime risk as the cumulative incidence (the probability of
138 lung cancer) by age 80 years. We modeled potential competing deaths^{18,19} which allows
139 estimation of lung cancer risk in a twin given the occurrence of other disease in his/her
140 co-twin. We obtained the case-wise concordances by age^{18,19} (see supplementary
141 material for details) as well as relative recurrence risks in MZ and DZ pairs and the
142 multilocus index.^{20,21}

143 We extended standard biometrical modelling methods to address issues of
144 censoring at follow-up^{7,22}. Results would agree with those obtained from standard
145 models for twin data^{18,23,24} if no censoring were present. Quantitative models were
146 analyzed to estimate the magnitude of variation explained by genetic and environmental
147 influences¹⁸ underlying the liability to develop lung cancer by smoking status. The
148 relative magnitude of genetic influences on variation in liability to lung cancer is thus
149 estimated among pairs in which neither had ever smoked, among pairs where both co-

150 twins are ever (former or current) smokers and among pairs in which both co-twins are
151 current smokers.

152 We use information on lung cancer incidence in MZ and DZ pairs to decompose
153 variation into additive genetic effects (A), dominant genetic effects (which represent
154 deviations of the heterozygote genotype from the mean of the homozygote genotype) (D),
155 common environmental effects (C), and individually unique environmental effects (E).
156 Within-pair covariance of liability is expressed as $\kappa \text{ var}(A) + \gamma \text{ var}(D) + \text{var}(C)$, where $\kappa =$
157 $\gamma = 1$ for MZ pairs and $\kappa = 1/2$ and $\gamma = 1/4$ for DZ pairs.¹⁸ We tested a series of models
158 sequentially to assess the significance of specific parameters. We estimated measurement
159 error in E which is the component of variance that does not contribute to within-pair
160 resemblance. Dominance effects are, typically, biologically implausible in the absence of
161 additive effects. The primary models are thus the ACE and ADE models, as well as their
162 sub-models AE, CE, and E. We assessed the fit of the sub-models by the Akaike
163 information criterion²².

164 We tested for equal thresholds (i.e., normal quantiles of prevalence) between MZ
165 and DZ twins, which is equivalent to assuming that the risk of disease does not differ by
166 zygosity. We tested for constant relative recurrence risk (RRR) over age by grouping
167 into five-year interval from age 65 to 90 years of age for MZ and DZ pairs. To correct for
168 possible bias due to censoring, individuals were assigned weights obtained by calculating
169 the inverse probability of being censored at time of follow-up^{7,18,19,22} Estimates have not
170 been adjusted for the effect of left-truncation that would cause an upwards bias, which is
171 not yet feasible for the approach.

172 For gene and smoking status interaction the magnitude on liability scale could not
173 be estimated due to having one concordant pair among all never-never and never-ever
174 smoking pairs. The presence of genetic interaction with smoking status was therefore
175 investigated by comparing observed concordance in strata of smoking status to the
176 expected when assuming same variance components on the liability scale as in ever-ever
177 pairs but using smoking-status specific cumulative incidence by age as well as follow-up
178 time of the specific pairs in the cohort. This procedure leads to an approximate test,
179 which we later refer to as the binomial test, and takes into account the smoking-status
180 specific cumulative incidence by age, as well as follow-up time of the specific pairs in the
181 cohort and we then computed the probability that a randomly selected pairs were
182 concordant using the dependence parameters of the liability threshold model for the ever-
183 ever pairs.

184 Among pairs in which one twin was a smoker and the other was not, we computed
185 within pair hazard ratios for the association of smoking with lung cancer using a Cox
186 model with pair-specific baseline hazard functions. Given that MZ pairs share their
187 genomic sequence, an association of smoking with lung cancer risk within such pairs is
188 independent of genetic liability. This hypothesis has historically competed with the
189 hypothesis²⁵ of shared genes underlying both smoking and lung cancer. The statistical
190 program R was used for all analyses with the package *met*.²⁶

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192

193

194 **Results**

195 Among those with smoking data, we recorded 1,508 incident lung cancers among
196 a total of 115,407 twin (43,512 MZ and 71,895 DZ) individuals. Forty-seven percent
197 were never smokers (n=54238), 16% former smokers (n=18,231) and 37% current
198 smokers (n=42,938) at baseline. Figure 1 shows the cumulative incidence of lung cancer
199 by smoking status (never, former, current) and sex. The risk of lung cancer diagnosis
200 before 80 years of age is estimated at 0.6% (95% CI 0.5%–0.7%) among never smokers,
201 2.0% (1.7%–2.3%) among former and 5.7% (5.4%–6.0%) among current smokers
202 adjusting for censoring and competing risk of death. The only sex difference is seen
203 among smokers. There was no difference in risk between MZ and DZ twin individuals.

204 The numbers of pairs concordant and discordant for lung cancer incidence are
205 presented in Table 2 for those with smoking data (n=50,595 pairs with smoking status on
206 both twins) overall and further classified by smoking status.

207 Among twin pairs where both are ever smokers, the risk of lung cancer in a twin
208 before a given age given that his or her co-twin also has lung cancer before that age, the
209 case-wise concordance by age is depicted in Figure 2 in both MZ and DZ pairs, as well as
210 the cumulative incidence of lung cancer by age in individuals. The case-wise
211 concordance risk was larger in MZ twins than the individual cumulative incidence risk,
212 testing for a difference from the cumulative incidence across the five year age intervals
213 (chisq=22.1, df=6, p=0.001). For the DZ twins we found that the case-wise concordances
214 were borderline significantly different from the cumulative incidence (chisq=13.4, df=6,
215 p=0.04). The estimated case-wise concordance at 90 years of age was 0.20 (0.13-0.27) for
216 MZ pairs and 0.13 (0.08-0.17) for DZ pairs.

217 This excess risk of MZ and DZ pairs of the case-wise concordance relative to the
218 population based individual cumulative incidence of lung cancer, the relative recurrence
219 risk (also known as the lambda value) is depicted in Figure 3 and demonstrates the
220 presence of familial effects at all ages. The RRR is higher at younger ages, in fact the
221 lung cancer risk is increased 10.2 -fold (3.2-17.2) at 65 years of age and decreases
222 significantly to a 3.6 (2.3-4.9) -fold increase at 90 years of age if a MZ co-twin is
223 diagnosed (p-value = 0.04, test for trend). The RRR is suggested to be constant by age for
224 DZ twins (p-value = 0.25, test for trend) (Figure 3). (A table of relative risks by age-
225 group is provided in supplemental Table 1.) We tested if the absolute differences of the
226 MZ and DZ curves at each five-year interval from age 65 to age 90 years of age were
227 significantly different, which there was no sign of (p-value=0.21). Our results are thus
228 consistent with the hypothesis of rather strong familial influences that do not increase
229 across age. We hypothesize that the genetic part of the familial influence may become
230 weaker by age.

231 We then examined evidence for genetic factors in the liability to develop lung
232 cancer by smoking status. Among pairs in which neither had ever smoked (7,871 MZ
233 pairs and 10,768 DZ pairs), there was one lung cancer concordant MZ pair with 43 MZ
234 and 59 DZ lung cancer discordant pairs. Heritability could not be estimated. However,
235 the dependence in the never-never and never-ever pairs was not significantly different
236 from the dependence among the ever-ever pairs (p=0.28, binomial test of observing more
237 than one concordant pair of lung cancer).

238 The overall estimate of familial aggregation (genetic variance and shared
239 environment component) for lung cancer liability is 44% with 38% (0.05- 0.72) of

240 variability attributed to genetic effects. When adjusted for smoking status, effects of
241 country and sex, variability attributed to genetic effects was 34% (0.00-0.70) (Table 3). A
242 comparison of the MZ and DZ tetrachoric within-pair correlations in liability to develop
243 lung cancer (Table 3) adjusting for age, sex, country and smoking, and further adjustment
244 for censoring hypothesizing equal correlations, gave a p-value of 0.07 (Wald test).
245 Among the pairs where both twins are ever (current or former) smokers, the heritability
246 estimates ranged from 28% (0.00-0.66) to 37% (0.25-0.49), depending on the
247 assumptions of the genetic model (Table 4). A pure environmental model did not fit the
248 data. Among current smokers, the heritability was estimated at 29% (0.00-0.74) or 41%
249 (0.26-0.56), depending on genetic assumptions (Table 4).

250 Finally, for smoking discordant pairs, we examined whether smoking status was
251 associated with future lung cancer. In the ever smoking discordant pairs (3,274 MZ pairs
252 and 8,350 DZ pairs), 40 MZ pairs were discordant for lung cancer (Table 5). Of these 35
253 cases were among ever smokers (with their non-smoking co-twin being unaffected) and
254 only five in the never-smokers (while their smoking co-twin was unaffected), yielding a
255 paired analysis hazard ratio (HR) of 5.4. Results for DZ pairs and for current-smoking
256 *versus* never smoking discordant pairs are shown in Table 5. Most discordant pairs arose
257 from pairs in which the smoker still smoked at baseline. None of the smoking discordant
258 pairs were concordant for lung cancer.

259

260

261 **Discussion**

262 In the largest study of lung cancer in twins to date, we found that genetic effects
263 account for a significant amount of the variation in the liability to develop lung cancer,
264 and the magnitude of this estimate is independent of smoking status. The largest estimate
265 of heritability in the liability to lung cancer was found in pairs where both were current
266 smokers at baseline. Among twin pairs where both twins were never smokers, only one
267 concordant lung cancer pair was seen and a formal estimate of heritability could not be
268 derived. A test of gene by smoking interaction was not significant suggesting that the
269 relative contribution of genetics does not vary by smoking status. Furthermore, testing
270 suggests that the contribution of familial effects does not increase by age. Our pairwise
271 analysis of smoking discordant pairs confirmed that smoking causes lung cancer
272 independent of genetic liability either to smoking or to lung cancer.

273 Twin pairs discordant for both lung cancer and smoking status at baseline are
274 informative for causal analyses. In the lung cancer and smoking doubly discordant pairs,
275 the pairwise relative risk for lung cancer was 5.4 among ever smokers in MZ pairs. It is
276 of historical interest that after the landmark papers of Doll and Hill²⁷ and Wynder and
277 Graham²⁸ in the early 1950s, the causality of the relationship between smoking and lung
278 cancer was soon challenged by the great statistician Ronald Fisher.²⁵ He pointed out the
279 greater similarity of MZ vs. DZ pairs for smoking, and indicated genetics as a potential
280 confounder. MZ pairs discordant for smoking would help to resolve the issue of
281 causality. Following up on prior twin studies of smoking discordant pairs,^{29,30} we can
282 now finally put this issue to rest, an issue debated for many years because of tobacco
283 industry's prolonged refusal to acknowledge publicly that smoking causes lung cancer.

284 Smoking is the most important cause of lung cancer. Taking smoking into
285 account permits us to test for the dependence of genetic effects on smoking status. The
286 overall estimate of familial aggregation (genetic variance and shared environment
287 component) for lung cancer liability is 44%, with most variability attributed to genetic
288 effects (38%), higher but still consistent with the estimate 26% (95% CI 0%–49%) by
289 Lichtenstein et al.³ also unadjusted for smoking and for censoring, but based on a smaller
290 number of affected pairs. We recently reported on the heritability for liability to lung
291 cancer in the entire NorTwinCan data, with an overall estimate of familial aggregation of
292 42%.⁴ The present analysis extends these estimates by accounting for the effect of
293 smoking status prior to disease occurrence and examines heritability among the smoking
294 pairs.

295 In our analysis, adjustment for smoking eliminates the estimates for shared
296 environmental effects. Shared environmental effects (i.e. exposure to smokers in the
297 childhood home, and among peers in adolescence) are of importance for the initiation of
298 smoking³¹ so it is not surprising that adjustment for smoking controls for this source of
299 variation. The highest estimates of heritability and recurrence risks were seen among
300 current smoking pairs. Among never smokers, we cannot estimate the heritability of lung
301 cancer.

302 Prior family² and twin^{3,4} studies of lung cancer have demonstrated familial
303 aggregation and provided very modest estimates for the role of genes. The Swedish
304 multi-generational register family study² estimated the heritability of lung cancer to be
305 8% (95% CI 5%–9%), without information on smoking in the families. The American
306 World War II veterans' study³² followed 12,938 male twin pairs for 44 years for

307 mortality. Among pairs with at least one lung cancer death, only 10 of 269 MZ pairs and
308 21 of 373 DZ pairs were concordant, and no heritability estimate was provided. Smoking
309 information was not used in the analysis, but smoking-related cancers showed less MZ –
310 DZ differences in similarity than other cancers. Despite the large number of pairs in our
311 present study, the final number of concordant pairs with smoking information was
312 limited. Thus, we could not examine heritability of lung cancer risk in relation to time
313 trends in lung cancer or histological subtypes of lung cancer. Nor did we have
314 information on smoking amount, duration or changes in smoking status comprehensively
315 and comparably assessed in all the twin cohorts.

316 Since detailed smoking information was not available, it should be acknowledged
317 as a potential limitation that there might be residual confounding that remains in the
318 estimates of heritability estimation. Because MZ twins, who are smokers, are also more
319 similar than DZ pairs in age of smoking initiation, amount smoked and duration of
320 smoking³¹, the heritability of lung cancer among smokers may still contain residuals
321 effects of genetics on smoking, and thus on lung cancer risk.

322 The overall genetic contribution to lung cancer as a function of smoking status is
323 relevant for gene discovery. Since 2007, 21 lung cancer genome-wide analysis (GWA)
324 and genome-wide meta-analysis studies³³ (www.genome.gov/gwastudies) have found the
325 strongest association to the CHRNA5 functional D398N (rs16969968) variant. The
326 functional changes^{34,35} in nicotinic acetylcholine receptor activity are linked to increased
327 risk for nicotine dependence, higher amount smoked³⁶⁻³⁹ and higher cotinine levels.^{40,41}
328 Thus, those with a risk allele smoke more, are more tobacco-dependent and are less likely
329 to quit, and therefore at higher risk of developing lung cancer. However, D398N is not a

330 risk factor for lung cancer in non-smokers, based on a GWA meta-analysis of 14,900
331 lung cancer cases and 29,485 controls⁶ and among 56,037 individuals from the HUNT
332 population study in Norway.⁵ This variant requires exposure to smoking to affect lung
333 cancer risk and thus contributes to the heritability seen among current smokers. In
334 contrast to D398N, associations with other loci found to be significant for lung cancer
335 such as those in 5p15 (TERT and CLPTM1L genes) and 6p21 (BAG6/BAT3) are found
336 also in non-smokers.^{33,6} The existence of a modest familial liability to lung cancer
337 independent of smoking status was also observed in the analysis of Utah genealogical
338 data.⁴² An increased risk of lung cancer was seen even in distant relatives; the high
339 proportion of non-smoking lung cancer cases (31%) and a large proportion of missing
340 data on smoking status (which was assessed through the death certificate and not
341 prospectively) calls for replication in other populations. A recent large meta-analysis
342 yielded an array-based heritability estimate for lung cancer of 21% (95% CI 14-27%).⁴³
343 This is somewhat smaller than our overall twin estimates suggesting that much of the
344 genetic liability to lung cancer is attributable to common variants, but other genetic
345 effects may exist. The same study estimated that 24% of the heritability of lung cancer is
346 accounted for by genetic determinants of smoking behavior.

347 In conclusion, our study extends earlier studies to examine the heritability in
348 liability to lung cancer by smoking status and age. We find no formal evidence for a gene
349 by environmental exposure interaction in lung cancer; more detailed environmental
350 exposures and larger sample sizes may be required. We hypothesize that a genetic part of
351 the rather strong familial influence demonstrated may become weaker by age. Studies of
352 genetic factors and hence molecular mechanisms in cancer would benefit by carefully

353 taking into account known environmental risk factors and identifying the population
354 groups at highest genetic risk using environmental stratification. However, the discordant
355 pair analysis conclusively demonstrates that tobacco exposure causes lung cancer even
356 when adjusting for genetic factors.
357

358 **Contributions**

359 Jacob Hjelmberg (J.H.) designed the study, contributed to developing the statistical
360 methodology, conducted the data analysis, interpreted the data, and wrote the methods
361 section of the manuscript.

362 Tellervo Korhonen (T.K.) contributed to the design and wrote the manuscript together
363 with J.H. and J.K.

364 (Drs. Hjelmberg and Korhonen contributed equally to this article.)

365 Klaus Holst made central contributions to developing the statistical methodology, took
366 part in conducting the statistical analysis as well as in revising the manuscript.

367 Axel Skytthe was responsible for quality assurance of the combined data set, conducted
368 the data analysis, reviewed and commented the manuscript.

369 Eero Pukkala contributed to quality assurance of the combined data set reviewed,
370 commented and edited the manuscript.

371 Julia Kutschke (nee Isaeva) helped to prepare the Norwegian data.

372 Jennifer R. Harris helped in the drafting and providing critical comments to manuscript.

373 Lorelei A. Mucci reviewed, commented and edited the manuscript.

374 Kaare Christensen reviewed, commented and edited the manuscript.

375 Hans-Olov Adami was involved in initiating, designing and funding the study as well as
376 in interpreting the results and editing the manuscript.

377 Thomas Scheike contributed to statistics and took part in revising the manuscript.

378 Jaakko Kaprio (J.K.) designed the study, contributed to data interpretation, and wrote the
379 manuscript together with J.H. and T.K.

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391

392 **Conflict of interest statement:**

393 Tellervo Korhonen and Jaakko Kaprio have consulted for Pfizer on nicotine dependence
394 from 2012 to 2015. Other authors declare no conflict of interest.

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505 **Table 1.** Characteristics of the twin cohorts included in the analyses by zygosity and sex
 506 (individuals with smoking data), NorTwinCan

Sex and zygosity of twin individuals	Denmark	Finland	Norway	Sweden	Total
Males					
MZ	5,309	3,421	2,532	8,525	19,787
DZ	8,263	8,035	3,313	14,262	33,873
UZ	480	1,247	-	1,131	2,858
All males	14,052	12,703	5,845	23,918	56,519
Females					
MZ	6,570	3,940	3,074	10,141	23,725
DZ	9,525	8,092	3,788	16,617	38,022
UZ	473	1,049	-	996	2,518
All females	16,568	13,081	6,862	27,754	64,265
Birth cohort included	1870–1982	1880–1957	1915–1960	1886–1958	
1st Year of assessment of smoking and start of lung cancer occurrence follow-up	1959	1975	1980	1961	
End of follow-up for lung cancer occurrence	2010	2011	2009	2010	
Number of incident lung cancers	354	341	152	661	1508
Mean age at baseline (years)	49.0	36.2	38.3	38.9	
Mean follow-up time (years)	10.2*	30.1	24.6	32.1	

507 Note: **The 5,376 twins with unknown zygosity are included in the table but are**
 508 **excluded from pairwise analysis.**
 509

510
 511 *In Denmark, smoking data came from eight surveys conducted from 1959 to 2002.
 512

513 **Table 2.** The numbers of pairs concordant and discordant for lung cancer at the end of follow-up by baseline pairwise smoking status
 514 and zygosity.
 515

Baseline pairwise smoking status	Pairwise lung cancer status					
	Monozygotic			Dizygotic		
	Number of Concordant Pairs		Number of Discordant Pairs	Number of Concordant Pairs		Number of Discordant Pairs
Concordant pairs for smoking	Neither affected	Both affected	One twin in the pair affected	Neither affected	Both affected	One twin in the pair affected
Never / Never	7827	1	43	10709	0	59
Ever / Ever	7942	29	332	11474	28	527
Current / Current#	4741	24	241	6341	24	356
Discordant pairs for smoking						
Never / Ever	3234	0	40	8177	0	173
Never / Current##	1982	0	35	5511	0	144

516
 517 # Current/current pairs are a subset of ever/ever pairs
 518 ## Never/current pairs are a subset of the never/ever pairs.
 519

520

521 **Table 3.** Heritability estimates for lung cancer in the NorTwinCan cohort among those in the present analysis with smoking data, with
522 and without adjustment for smoking status (n=1508 cases). All estimates adjusted for country and sex.

523

Number of complete MZ/DZ pairs	Casewise concordance rates 95% Confidence Intervals		Adjustment for smoking	Variance component estimates 95% Confidence Intervals		
	MZ	DZ		A	C	E
5299	0.22	0.13	No	0.38 0.05 to 0.72	0.06 0.00 to 0.31	0.55 0.43 to 0.68
9359	0.15 to 0.29	0.09 to 0.17	Yes	0.34 0.00 to 0.70	0.02 0.00 to 0.29	0.64 0.50 to 0.78

524

525 Note: Variance components are: A: additive genetic effects, C: common environmental effects, and E: individually unique

526 environmental effects estimated from biometrical twin model taking into account censoring (see methods in the online supplement).

527

528

529 **Table 4.** Pairwise correlations in liability, heritability estimates and model fit parameters for liability to incident lung cancer among
 530 ever smoking and current smoking concordant twin pairs from the NorTwinCan study. Estimates of genetic (A), shared environmental
 531 (C), and unshared environmental (E) variance are presented for the ACE, AE, and CE models.
 532

Model	Correlation (95% CI)		A	C	E	AIC	p-value
	MZ	DZ	Estimate (95%CI)	Estimate (95%CI)	Estimate (95%CI)		
Ever smokers							
ACE	0.35 (0.21–0.49)	0.21 (0.09–0.33)	0.28 (0.0–0.66)	0.07 (0.0–0.36)	0.65 (0.50–0.79)	38759.12	0.01 ¹
AE			0.37 (0.25–0.49)	0 -	0.63 (0.51–0.75)	38757.92	0.35
CE			0	0.28 (0.19–0.37)	0.72 (0.63–0.81)	38764.19	0
Current smokers							
ACE	0.39 (0.20–0.55)	0.24 (0.10–0.38)	0.29 (0.0–0.74)	0.10 (0.0–0.44)	0.62 (0.44–0.79)	30484.27	0.12 ¹
AE			0.41 (0.26–0.56)	0 -	0.59 (0.44–0.74)	30483.46	0.27
CE			0	0.31 (0.20–0.42)	0.69 (0.58–0.80)	30488.49	0.01

533 ¹Compared to saturated model, the other models are compared to ACE model.

534 ² 95%CI for C effect here could not be estimated reliably

535 **Table 5.** Lung cancer in twin pairs discordant for smoking at baseline by zygosity and smoking status
 536

Smoking discordance	Zygosity	Pairs in which smoker had lung cancer and the non-smoking cotwin did not	Pairs in which non- smoker had lung cancer and the smoking cotwin did not	Hazard ratios (95% CI) and p-value
Ever/never	MZ	35	5	5.4 (2.1–14.0); p=0.0005
	DZ	145	28	5.0 (3.2–7.9); p=1.4e-12
Current/never	MZ	31	4	6.0 (2.1-17.3) p=0.001
	DZ	124	20	5.9 (3.5-9.8) p=1.4e-11

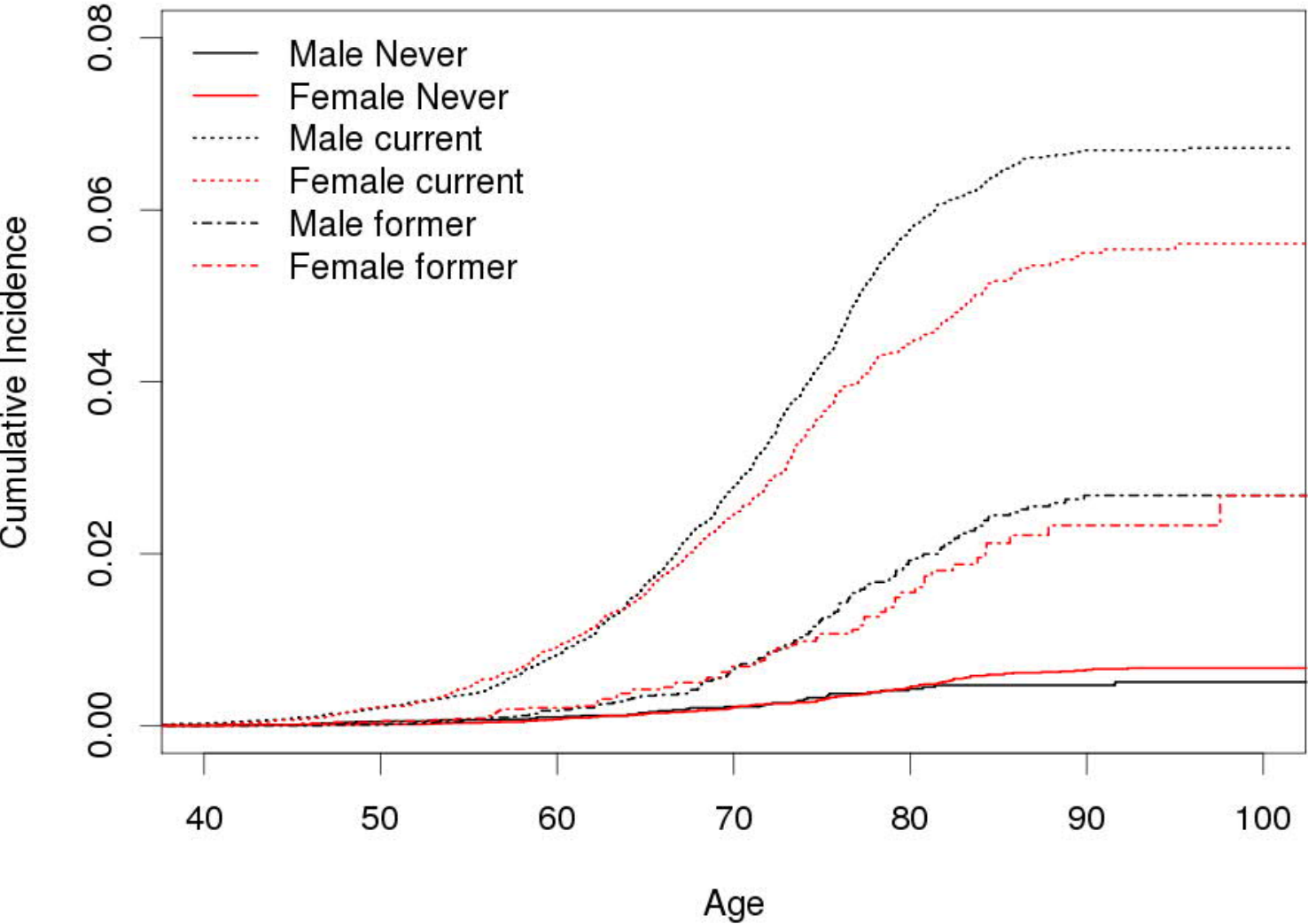
Figure legends

Figure 1. Cumulative incidence of lung cancer by smoking status (never, former, current) and sex (male, female). Cumulative incidence curves are adjusted for censoring, delayed entry to cancer registration, and competing risk of death. (Continuous lines are for never smokers, dashed lines for former smokers and dotted lines for current smokers; black for males and red for females).

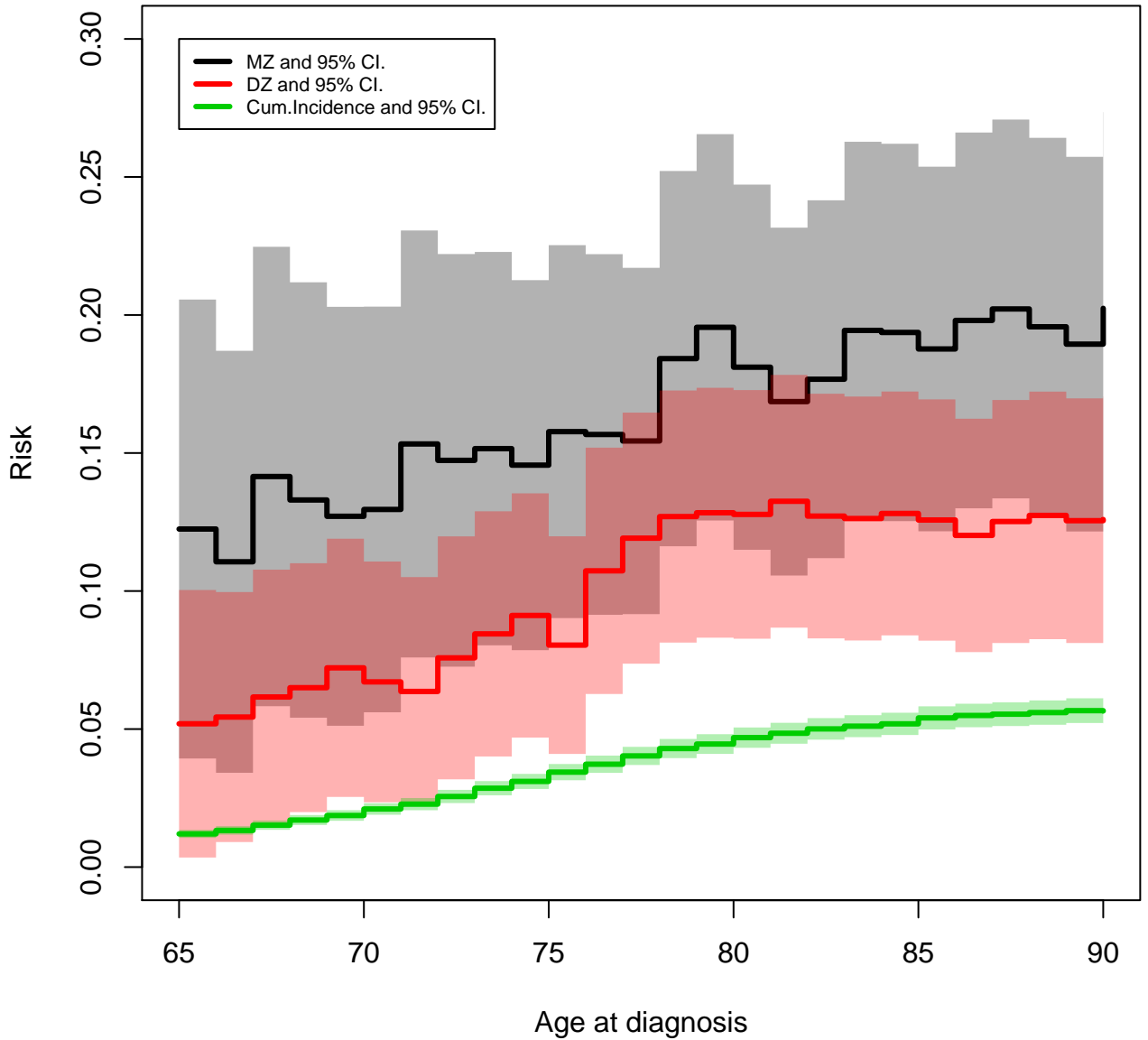
Figure 2. Case-wise concordance risk of lung cancer in MZ and DZ pairs compared to population risk among ever smokers, by age at diagnosis.

Figure 3. Relative recurrence risk ratio of lung cancer in MZ and DZ pairs compared to population risk among ever smokers, by age at diagnosis.

Cumulative incidence by sex and smoking status



Ever Smokers



Ever Smokers

