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ARTICLE

Epidemiology



Mendelian randomisation study of height and body mass index as modifiers of ovarian cancer risk in 22,588 *BRCA1* and *BRCA2* mutation carriers

Frank Qian et al.

BACKGROUND: Height and body mass index (BMI) are associated with higher ovarian cancer risk in the general population, but whether such associations exist among *BRCA1/2* mutation carriers is unknown.

METHODS: We applied a Mendelian randomisation approach to examine height/BMI with ovarian cancer risk using the Consortium of Investigators for the Modifiers of *BRCA1/2* (CIMBA) data set, comprising 14,676 *BRCA1* and 7912 *BRCA2* mutation carriers, with 2923 ovarian cancer cases. We created a height genetic score (height-GS) using 586 height-associated variants and a BMI genetic score (BMI-GS) using 93 BMI-associated variants. Associations were assessed using weighted Cox models.

RESULTS: Observed height was not associated with ovarian cancer risk (hazard ratio [HR]: 1.07 per 10-cm increase in height, 95% confidence interval [CI]: 0.94–1.23). Height-GS showed similar results (HR = 1.02, 95% CI: 0.85–1.23). Higher BMI was significantly associated with increased risk in premenopausal women with HR = 1.25 (95% CI: 1.06–1.48) and HR = 1.59 (95% CI: 1.08–2.33) per 5-kg/m² increase in observed and genetically determined BMI, respectively. No association was found for postmenopausal women. Interaction between menopausal status and BMI was significant ($P_{interaction} < 0.05$).

CONCLUSION: Our observation of a positive association between BMI and ovarian cancer risk in premenopausal *BRCA1/2* mutation carriers is consistent with findings in the general population.

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BACKGROUND

Ovarian cancer is the fifth leading cause of cancer deaths in US women, due to its typically advanced stage at presentation.^{1,2} Furthermore, unlike breast or colorectal cancer, there is no proven screening method for ovarian cancer to identify early disease and initiate treatment to improve survival.^{3,4} Family history, oral contraceptive use, parity, body mass index (BMI), and genetic variants are potentially useful in estimating lifetime risk.¹ In particular, inherited *BRCA1* and *BRCA2* mutations are associated with increased lifetime risk of ovarian cancer and account for ~10–15% of overall disease incidence.^{5–7} However, among mutation carriers, age at diagnosis is variable. Penetrance of *BRCA1/2* mutations is likely modified by other genetic variants and lifestyle or reproductive factors.^{8,9} Investigation of these factors could aid in implementation of strategies to reduce ovarian cancer risk among mutation carriers.

Both height and BMI are quantitative traits with substantial genetic bases. In recent genome-wide association studies (GWAS), numerous genetic variants were found to be associated with these traits.^{10,11} In the general population, both height and BMI appear to be positively but inconsistently associated with risk of ovarian cancer.^{12–14} Previous studies also showed that the association between BMI and ovarian cancer was stronger in premenopausal women.^{12,15,16} Because of differences in age at onset and tumour histology/grade, risk factors for ovarian cancer might be different

for *BRCA1/2* mutation carriers than women in the general population.¹⁷ Only one case–control study, with 469 ovarian cancer cases, has examined anthropometric measurements in *BRCA1/2* mutation carriers and found that neither height nor BMI were related to ovarian cancer risk.¹⁸ Larger, adequately powered studies are needed to assess whether a relationship between either height or BMI and ovarian cancer risk exists for *BRCA1/2* mutation carriers, and whether the direction of association is concordant with that in the general population.

Mendelian randomisation (MR) methods use genetic markers associated with a trait as an instrumental variable (IV) to assess their potential relationship with a disease outcome.^{19–21} Compared to traditional epidemiologic approaches, MR can reduce biases such as reverse causation and residual confounding, which can interfere with causal interpretations. However, the MR approach requires that the genetic variants are associated with the exposure, the variants are not or only weakly associated with confounding factors in the causal pathway, and the variants only affect disease risk through the exposure (i.e. absence of pleiotropic effects).^{20,21} To the degree that these assumptions are met, the MR approach can strengthen the evidence for a causal relationship between exposure and disease.

Herein, using traditional epidemiologic and MR methods, we conducted analyses of height and BMI and their association with ovarian cancer risk in the Consortium of Investigators for the

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Modifiers of *BRCA1/2* (CIMBA) with 22,588 participants. We examined heterogeneity of these associations with respect to the mutation carried (*BRCA1* vs *BRCA2*), menopausal status, tumour histology, and tumour grade.

METHODS

Characteristics of the CIMBA consortium and information on specific genotyping protocols are provided in Supplementary Methods and were described previously.^{22–24}

Selection of genetic variants

From the latest publications of the Genetic Investigation of Anthropometric Traits, we identified single-nucleotide polymorphisms (SNPs) associated with height or BMI at genome-wide significance level ($P < 5 \times 10^{-8}$).^{11,25} SNPs with low imputation quality (<0.5) were excluded, leaving 586 SNPs for height and 93 for BMI. Supplementary Tables 1 and 2 provide additional details on these SNPs.

Statistical analysis

Calculation of the height and BMI genetic scores (GS) was described in detail previously.²⁴ Briefly, we calculated the weighted sums of all of the height- and BMI-associated variants under additive models, which do not include interactions between variants. Namely, we used the formulas: Height – GS = $\sum_{i=1}^{93} \beta_{XGi}$ SNP_i and BMI – GS = $\sum_{i=1}^{93} \beta_{XGi}$ SNP, where β_{XGi} is the literature-reported per-allele magnitude of association of the *i*th SNP for height and BMI, respectively. A scaling factor was calculated by regressing each GS against its respective trait among non-case carriers. The corresponding regression coefficients were β_0 (intercept = 165.455) and β_1 (slope = 5.217) for height and β_0 (22.607) and β_1 (5.523) for BMI. In the present study, BMI-GS was scaled to BMI at the date of questionnaire, rather than BMI at age 18 years, as previous GWAS were based on BMI measurements in middle-aged adults.

We subsequently modelled each scaled GS against ovarian cancer risk using weighted Cox models. Our primary outcome of interest was ovarian cancer diagnosis, with individuals censored for breast cancer diagnosis, risk-reducing bilateral salpingooophorectomy, death, or end of follow-up, whichever occurred first. Owing to the study design of CIMBA, weights in the model were applied for cases and non-cases based on previously observed incidence of ovarian cancer in BRCA1/2 carriers.^{26,2} We applied a robust sandwich variance-estimation approach to the risk estimates to account for non-independence among multiple carriers per family. In addition, we performed subgroup analyses by BRCA1/2 mutations and menopausal status. Menopausal status was defined as a time-varying covariate, coded as premenopausal from birth until age at natural menopause or bilateral salpingo-oophorectomy. For individuals with missing age at menopause, we imputed the age as 50 years. Imputing missing age at menopause as 46 years did not materially change the results. The mean and median ages at natural menopause in this population were 46 and 48 years, respectively. All analyses were adjusted for the first eight principal components (to account for ethnicity and population stratification), birth cohort, and country of enrolment. Additional analyses assessed the associations of height and BMI with ovarian cancer subgroups by histological type (serous vs. non-serous) and by tumour grade (well or moderately differentiated tumours vs. poorly or undifferentiated).

In addition, phenotype associations with each individual height and BMI variant were assessed and pooled using inverse varianceweighted meta-analysis. The individual associations were obtained by first extracting β_{XGi} for each SNP *i*, which represents the perallele magnitude of association with height or BMI from previous GWAS. Next, we calculated β_{YGi} and $SE(\beta_{YGi})$ using multivariateadjusted weighted Cox models for each SNP using the CIMBA 181

data, where ovarian cancer risk is predicted by genotype *G* (with G = 0, 1, 2 for the allele corresponding to greater height or BMI), principal components, birth cohort, *BRCA* mutation, and country of enrolment. The overall causal association (β_{YX}) is calculated using inverse-variance weighted estimate of each variant's effect: $\beta_{YX} = \frac{\sum_{i} \beta_{XGi} SE(\beta_{YGi})^{-2}}{\sum_{i} \beta_{XGi}^2 SE(\beta_{YGi})^{-2}}$. Standard error was estimated as $SE_{YX} = \sqrt{\frac{1}{\sum_{i} \beta_{XGi}^2 SE(\beta_{YGi})^{-2}}}$ using the Burgess's method.^{19,28} Egger's test was

used to assess for possible pleiotropic effects of the variants (i.e. whether variants influence the outcome through other pathways), to ensure that this assumption held.²⁹

Finally, in participants with available data on height and BMI, we conducted a formal IV analysis using the method of two-stage residual inclusion regression.³⁰ In stage one, observed height or BMI was regressed against the corresponding GS, principal components, birth cohort, country, and mutation status. In the second stage, we used a Cox model to fit ovarian cancer risk against height or BMI, birth cohort, country, mutation status, and residuals from stage one. Variance estimates were obtained through 10,000 boot-straps (see details in Supplementary Methods). In these individuals, we also analysed the association between observed measurements of height or BMI and ovarian cancer risk using weighted Cox models, adjusted for established ovarian cancer risk factors, including birth cohort, menopausal status, age at menarche (years), and parity (continuous). The BMI values used were obtained at the date of questionnaire, usually close to the date of genetic testing and recalled for BMI at age 18 years.

In models with menopausal status as time-varying variable, the test for heterogeneity by menopausal status was essentially a test of the proportional hazards assumption. All analyses were performed using SAS 9.4 (SAS Institute, Cary, NC) and Stata 14.0 (StataCorp, College Station, TX). A two-sided *P*-value < 0.05 was considered statistically significant unless stated otherwise.

RESULTS

Demographic and clinical characteristics

Characteristics for the 22,588 individuals in the CIMBA consortium, comprising 14,676 *BRCA1* and 7912 *BRCA2* mutation carriers, are shown in Table 1. We documented 2923 women with ovarian cancer (*BRCA1:* 2319; *BRCA2:* 604). Compared with non-cases, participants who developed ovarian cancer were more often parous women, were younger at first live birth, and were from earlier birth cohorts. At the date of questionnaire/interview, height measurement was available for 7657 participants and BMI measurement for 7516 participants. Most tumours for *BRCA1/2* mutation carriers were invasive, of serous, poorly, or undifferentiated grade, and stages 3 or 4 at diagnosis, characteristics which are consistent with prior reports.³¹

Observed and predicted height on risk of ovarian cancer

In the survival modelling of ovarian cancer risk, age was used as the underlying timescale and the numbers of individuals retained in the analysis were 20535, 14647, 7375, and 2832 at ages 30, 40, 50, and 60 years, respectively, suggesting that statistical power for the late age is limited. After adjustment for birth cohort, country of enrolment, mutation, menopausal status, and principal components, a nonsignificant association was found for observed height and ovarian cancer risk (hazard ratio (HR) = 1.07 per 10-cm increase, 95% confidence interval (CI): 0.94–1.23, P = 0.31) (Table 2). We found broadly consistent associations of height in both *BRCA1* and *BRCA2* mutation carriers by menopausal status and by tumour histological type and grade.

The height GS was significantly associated with height in all participants, in ovarian cancer cases, and in non-case participants (all $P < 10^{-24}$) (Supplementary Table 3). Overall, approximately

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Variable	Ovarian cancer cases, N = 2923	Non-cases, <i>N</i> = 19,665	P value ^t
Mutation carrier status			<0.0001
BRCA1	2319 (79.3)	12,357 (62.8)	
BRCA2	604 (20.7)	7308 (37.2)	
Year of birth,	1948	1960	<0.0001
median (IQR)	(1940, 1955)	(1951, 1969)	
Age at diagnosis or censoring, years (mean ± SD)	52.5 ± 9.8	44.7 ± 12.4	<0.0001
Ethnicity, <i>n</i> (%)			0.07
Caucasian, not otherwise specified	2060 (89.7)	13,613 (88.4)	
Ashkenazi Jewish	237 (10.3)	1780 (11.6)	
Height in cm, <i>n</i>	784	6873	
Mean \pm SD	163.2 ± 6.5	164.8±6.9	<0.0001
Weight at baseline ^a in kg, <i>n</i>	780	6789	
Mean \pm SD	69.0 ± 14.6	68.5 ± 14.1	0.32
Body mass index at baseline ^a in kg/m ² , <i>n</i>	772	6744	
Mean \pm SD	25.9 ± 5.3	25.2 ± 5.1	0.0002
Weight in early adulthood in kg, <i>n</i>	536	4,912	
Mean \pm SD	56.5 ± 8.3	57.9 ± 9.5	0.0007
Body mass index in early adulthood in kg/m ² , <i>n</i>	536	4881	
Mean \pm SD	21.2 ± 3.0	21.3 ± 3.3	0.43
Age at menarche in years, <i>n</i>	771	6688	
Mean \pm SD	13.0 ± 1.5	13.0 ± 1.5	0.90
Parous, n (%)			<0.0001
Yes	805 (88.3)	5790 (77.4)	
No	107 (11.7)	1692 (22.6)	
Age at first live birth in years, <i>n</i>	735	5555	
Mean \pm SD	24.4 ± 4.5	25.4 ± 4.9	<0.0001
Menopausal status, n (%)			<0.0001
Premenopausal	112 (11.5)	3816 (51.1)	
Postmenopausal	863 (88.5)	3654 (48.9)	
Age at menopause, years (mean ± SD)	46.8±5.7	44.7 ± 6.1	<0.0001
Tumour behaviour, n (%)			
Invasive	1228 (99.2)		
Borderline	10 (0.8)		
Tumour histotype, <i>n</i> (%)			
Serous	892 (67.9)		
Mucinous	20 (1.5)		
Endometrioid	141 (10.7)		
Clear cell	17 (1.3)		
Other	243 (18.5)		
Tumour grade, <i>n</i> (%)			
Well differentiated	43 (4.6)		
Moderately	196 (21.0)		

Variable	Ovarian cancer cases, $N = 2923$	· · · · · · · · · · · · · · · · · · ·	P value ^t
Poorly/ undifferentiated	696 (74.4)		
Tumour stage, n (%)			
Borderline	2 (0.3)		
Stage 1	121 (16.4)		
Stage 2	93 (12.6)		
Stage 3	412 (55.7)		
Stage 4	112 (15.1)		
interquartile range, Sa ^a Reported at the date ^b P values for compari		were calculated	, -

13.4% of the variation in height was explained by the height GS. Besides height, we found weaker associations between the height GS and body weight and age at menarche.

In MR analysis, height GS had a nonsignificant positive association with ovarian cancer risk, HR = 1.02 per 10-cm increase in genetically predicted height, 95% CI: 0.85–1.23, P = 0.82 (Table 3). We found similar associations by subgroups of mutation, menopausal status, and tumour grade.

Combining the effects of all 586 height-associated variants using inverse-variance weighted meta-analysis, we obtained similar findings (HR = 1.02, 95% CI: 0.83–1.26, P = 0.83) (λ). Among the SNPs that were combined, there was a low degree of heterogeneity ($l^2 = 0$ %). Examining small-study effects using Egger's test did not suggest likely pleiotropic effects. In the two-stage residual inclusion analysis, the estimated relative risk was larger though with wide CIs, which overlapped with those derived using other methods (HR = 1.20, 95% CI: 0.86–1.69, P = 0.29).

Observed and predicted BMI on risk of ovarian cancer

After multivariable adjustment, we found a nonsignificant positive association between BMI at the date of questionnaire completion and ovarian cancer risk, HR = 1.04 per 5-kg/m² increase in BMI, 95% Cl: 0.95–1.14, P = 0.42 (Table 4). In a pre-specified analysis, the association between BMI and ovarian cancer risk was stronger in premenopausal women (HR = 1.25, 95% Cl: 1.06–1.48; P = 0.009), whereas no association was found in postmenopausal women (HR = 0.98, 95% Cl: 0.88–1.10), with significant interaction (P = 0.02). We found that BMI was a significant predictor of nonserous ovarian cancer risk (HR = 1.25, 95% Cl: 1.06–1.49) but not for serous ovarian cancer (HR = 0.98, 95% Cl: 0.84–1.15).

Similar to BMI at the date of questionnaire completion, we detected a significant interaction of BMI in young adulthood and menopausal status (P = 0.01), with a stronger association for premenopausal women (HR = 1.34, 95% CI: 0.97–1.84) compared with postmenopausal women (HR = 0.82, 95% CI: 0.65–1.04).

BMI-GS was strongly associated with BMI at both the date of questionnaire completion and young adulthood (Supplementary Table 4). Overall, the BMI-GS explained 2.6% of the variation in BMI at the date of questionnaire completion and 1.7% of the variation in young adulthood BMI. We found associations between the BMI-GS and height and age at menarche, though the strength of the association was weaker than the association with BMI.

In the entire consortium, the BMI-GS had a nonsignificant positive association with ovarian cancer risk with a HR = 1.10 per 5-kg/m² of genetically predicted BMI, 95% CI: 0.86–1.42, P = 0.44 (Table 5). We found heterogeneity by menopausal status (P = 0.006). BMI-GS was positively associated with ovarian cancer risk in premenopausal

	N/events	HR (95% CI)	P value
er 10 cm increase in observed hei	ght		
All participants (confounding ac	ljustment se	quentially)	
Adjusted for principal components	7657/784	1.12 (0.97–1.29)	0.12
Additionally adjusted for country	7657/784	1.15 (1.00–1.32)	0.06
Additionally adjusted for birth cohort	7657/784	1.05 (0.91–1.21)	0.53
Additionally adjusted for mutation status	7657/784	1.06 (0.92–1.22)	0.42
Additionally adjusted for menopausal status	7657/784	1.07 (0.94–1.23)	0.31
Additionally adjusted for parity and age at menarche	7090/724	1.09 (0.94–1.26)	0.24
By mutation status ^a			
BRCA1 carrier	4502/552	1.07 (0.91–1.24)	0.42
BRCA2 carrier	3155/232	1.11 (0.85–1.45)	0.44
Pinteraction			0.64
By menopausal status ^b			
Premenopausal	7657/105	1.02 (0.72–1.42)	0.93
Postmenopausal	4328/679	1.09 (0.94–1.26)	0.27
P _{interaction}			0.71
By tumour subtype ^c			
Serous	7360/319	1.07 (0.87–1.31)	0.52
Non-serous ^d	7360/168	1.30 (1.01–1.68)	0.045
P _{het}			0.24
By tumour grade ^c			
Well or moderately differentiated	7252/111	1.12 (0.83–1.52)	0.46
Poorly/undifferentiated	7252/268	1.15 (0.93–1.43)	0.19
P _{het}			0.89

Association of height and ovarian cancer risk using observed

HR hazard ratio, CI confidence interval

Table 2

^aAdjusted for principal components, birth cohort, country of enrolment, and menopausal status in weighted Cox model

^bAdjusted for principal components, mutation status, birth cohort, and country of enrolment

^cAdjusted for principal components, birth cohort, country of enrolment, mutation status, and menopausal status

^dIncludes endometrioid, mucinous, clear cell, and other histologic types Bolded line refers to the model corresponding to our main results

women (HR = 1.59, 95% Cl: 1.08–2.33) but not in postmenopausal women (HR = 0.80, 95% Cl: 0.58–1.11). BMI-GS also tended to be more associated with non-serous (HR = 1.60, 95% Cl: 0.83–3.08) than serous tumours (HR = 0.92, 95% Cl: 0.59–1.43).

We found similar results when we statistically combined the associations of the 93 BMI-associated variants, with an overall HR = 1.12, 95% CI: 0.86–1.46. Heterogeneity was low ($l^2 = 15.9\%$), indicating a low likelihood of pleiotropic associations. Using the two-stage residual inclusion approach, we found a generally similar association (HR = 1.37, 95% CI: 0.84–2.24, P = 0.21).

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Individual SNPs and ovarian cancer risk

We found 22 height-associated and 4 BMI-associated SNPs that were nominally associated with ovarian cancer risk (P < 0.05; Table 6). None of these SNPs were significantly associated with ovarian cancer risk after correcting for multiple testing. We cross-checked these identified SNPs with the most up-to-date list of ovarian cancer susceptibility SNPs and did not find any overlaps.³²

DISCUSSION

Using data from a large international consortium of *BRCA1/2* mutation carriers, we found no statistically significant association between height and ovarian cancer risk. Interestingly, we observed interactions between BMI (both observed and genetically predicted) and menopausal status on ovarian cancer risk, with increasing BMI associated with increased risk in premenopausal but not in postmenopausal women.

Our finding of a positive association between BMI and overall ovarian cancer risk in BRCA1 and BRCA2 mutation carriers is corroborated by several prior studies in the general population.^{12,14,15,33} One MR analysis using 77 BMI-associated SNPs, conducted in the general population, found that each 1-standard deviation (SD) increment in genetically-predicted adult BMI corresponded to an odds ratio (OR) of 1.35 (95% CI: 1.05–1.72).³⁴ We found that 5-kg/m² (about 1 SD) increment in genetically predicted BMI was associated with an HR = 1.10 (95%) Cl: 0.86-1.42) in mutation carriers. However, the association of BMI with ovarian cancer risk is likely to vary by menopausal status. In the general population, significant differential association of BMI with ovarian cancer risk by menopausal status has been found in some studies^{15,16,35,36} but not in others.^{12,37} A pooled analysis of 47 epidemiologic studies with 25,157 ovarian cancer cases showed that the relative risk per 5-kg/m² increase in BMI was 1.12 (95% Cl: 1.07–1.17) in premenopausal women and 1.08 (95% Cl: 1.04–1.12) in postmenopausal women.¹² The largest single cohort study, with 3686 ovarian cancer cases, found that the HR per 5-kg/m^2 increase in BMI was 1.21 (99% CI: 1.09–1.33) in premenopausal and 1.07 (99% Cl: 1.02-1.12) in postmenopausal women.¹⁵ An MR analysis conducted in the general population also observed stronger associations for non-high-grade serous carcinomas in premenopausal women (OR = 1.62, 95% CI: 0.88–3.01) compared with postmenopausal hormone replacement therapy (HRT) users (OR = 1.26, 95% CI: 0.57-2.82) and postmenopausal HRT non-users (OR = 1.17, 95% CI: 0.61–2.24), though no formal statistical tests examining heterogeneity were performed.¹⁴ Similarly, we found in BRCA1/2 mutation carriers that 5-kg/m² increment in genetically predicted BMI was associated with an HR = 1.59 (95% CI: 1.08–2.33) for premenopausal ovarian cancer and an HR = 0.80 (95% CI: 0.58-1.11) for postmenopausal ovarian cancer. Studies that have not demonstrated significant variation by menopausal status tended to show that the positive association between BMI and ovarian cancer risk was primarily among those who had never used HRT.¹² Taken together, our results and previous literature are suggestive that higher BMI may increase ovarian cancer risk in premenopausal women but not in postmenopausal women.

In addition, several studies that had sufficient numbers of cases to evaluate the relationship between BMI and ovarian cancer risk by histologic subtype have shown significant heterogeneity. Observational studies in the Ovarian Cancer Cohort Consortium found stronger associations between BMI and endometrioid (OR = 1.17 per 5-kg/m², 95% CI: 1.11–1.23) or mucinous ovarian cancer (OR = 1.19, 95% CI: 1.06–1.32) but no association with serous ovarian cancer (OR = 0.98, 95% CI: 0.94–1.02).¹⁶ A more recent MR analysis in the same consortium using a genetic score comprised of 87 SNPs showed that a genetically predicted BMI had a stronger association with endometrioid (OR = 1.17, 95% CI: 0.87–1.59) or mucinous ovarian cancer (OR = 1.18, 95% CI: 0.84–1.67) than high-grade

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	N/events	HR (95% CI)	P value	Heterogeneity (I ²
Height GS ^a				
All participants (confounding adjustment sequentially	()			
Adjusted for principal components	22,588/2923	0.99 (0.82–1.19)	0.89	
Additionally adjusted for country	22,588/2923	0.97 (0.81–1.17)	0.77	
Additionally adjusted for birth cohort	22,588/2923	0.98 (0.82–1.18)	0.83	
Additionally adjusted for mutation status	22,588/2923	1.02 (0.85–1.22)	0.13	
Additionally adjusted for menopausal status	22,588/2923	1.02 (0.85–1.23)	0.82	
By mutation status ^b				
BRCA1 carrier	14,676/2319	1.02 (0.83–1.25)	0.87	
BRCA2 carrier	7912/604	1.04 (0.68–1.57)	0.87	
P _{interaction}			0.99	
By menopausal status ^c				
Premenopausal	22,588/967	0.96 (0.73–1.26)	0.77	
Postmenopausal	9219/1955	1.08 (0.85–1.38)	0.52	
P _{interaction}			0.50	
By tumour subtype ^d				
Serous	20,978/892	1.36 (0.97–1.90)	0.08	
Non-serous	20,978/421	0.95 (0.58–1.56)	0.84	
P _{het}			0.25	
By tumour grade ^d				
Well or moderately differentiated	20,600/239	1.63 (0.86–3.09)	0.14	
Poorly/undifferentiated	20,600/696	1.20 (0.82–1.74)	0.35	
P _{het}			0.42	
Meta-analysis method ^e				
All participants	22,588/2923	1.02 (0.83–1.26)	0.83	0.0%
BRCA1 carrier	14,676/2319	1.02 (0.81–1.28)	0.89	0.0%
BRCA2 carrier	7912/604	1.05 (0.67–1.66)	0.82	7.0%
P _{interaction}			0.89	
Γwo-stage residual inclusion method ^f				
All participants	7657/784	1.20 (0.86–1.69)	0.29	
BRCA1 carrier	4502/552	1.40 (0.94–2.10)	0.10	
BRCA2 carrier	3155/232	0.93 (0.49–1.74)	0.81	

^aHeight genetic score combining 586 height-associated single-nucleotide polymorphisms (SNPs)

^bAdjusted for principal components, birth cohort, country of enrolment, and menopausal status in weighted Cox model

^cAdjusted for principal components, mutation status, birth cohort, and country of enrolment

^dAdjusted for principal components, mutation status, menopausal status, birth cohort, and country of enrolment

^eHRs were calculated using inverse-variance meta-analysis and re-scaled to the corresponding units by calculating the height measurements per z-score among controls. Effect estimates for ovarian cancer for each SNP were calculated from weighted Cox model adjusting for principal components, birth cohort, country of enrolment, menopausal status, and mutation status

^fAnalysis was performed among 7657 participants with measured height

Bolded line refers to the model corresponding to our main results

serous cancer (OR = 1.06, 95% CI: 0.89-1.27), though the 95% CIs for these estimates were largely overlapping.¹⁴ Consistent with findings in the general population, our study in BRCA1/2 mutation carriers showed that BMI was positively associated with non-serous ovarian cancer (HR = 1.25 per 5-kg/m², 95% CI: 1.06–1.49 in observed BMI and HR = 1.60, 95% CI: 0.83–3.08, per 5-kg/m² in genetically predicted BMI), of which endometrioid is a major subtype. Of note, obesity is an established risk factor for endometrial cancer.³ However, subsequent studies with greater number of cases of different ovarian cancer subtypes are needed to assess whether the effect of obesity truly differs by tumour subtype.

Our finding of a nonsignificant positive association between height and ovarian cancer risk is also consistent with prior epidemiological studies in the general population.^{12,37,39} In the

general population, 5-cm increment in height was associated with a 7% increase (95% CI: 5–9%) in ovarian cancer risk,¹² and 5-cm increment in genetically predicted height was associated with a 6% (95% CI: 1–11%) increase in ovarian cancer risk.³⁹ The associations for observed height did not differ significantly between ovarian histological types,^{2,12} while genetically predicted height had a stronger association with clear cell (OR = 1.20, 95% CI: 1.04–1.38) or low-grade/borderline serous ovarian cancers (OR = 1.15, 95% CI: 1.01-1.30) compared to high-grade serous (OR = 1.05, 95% CI: 0.99-1.11).³⁹ We did not find statistically significant heterogeneity by histology in our study of mutation carriers, though point estimates varied across histology.

Several biological mechanisms potentially explain the associations observed in our study. Overweight/obese women are more

	N/events	HR (95% CI)	P value
Per 5 kg/m ² increase in BMI at date of questionnaire			
All participants (confounding adjustment sequentially)			
Adjusted for principal components	7516/772	1.00 (0.90–1.10)	0.96
Additionally adjusted for country	7516/772	0.99 (0.90-1.09)	0.84
Additionally adjusted for birth cohort	7516/772	1.02 (0.93–1.12)	0.72
Additionally adjusted for mutation status	7516/772	1.06 (0.96–1.16)	0.26
Additionally adjusted for menopausal status	7516/772	1.04 (0.95–1.14)	0.42
Additionally adjusted for parity and age at menarche	6964/715	1.04 (0.94–1.14)	0.48
By mutation status ^a			
BRCA1 carrier	4401/543	1.06 (0.95–1.17)	0.31
BRCA2 carrier	3115/229	0.96 (0.81–1.15)	0.67
P _{interaction}			0.35
By menopausal status ^b			
Premenopausal	7516/102	1.25 (1.06–1.48)	0.009
Postmenopausal	4257/670	0.98 (0.88-1.10)	0.78
Pinteraction			0.02
By tumour subtype ^c			
Serous	7223/312	0.98 (0.84–1.15)	0.83
Non-serous ^d	7223/167	1.25 (1.06–1.49)	0.01
P _{het}			0.04
By tumour grade ^c			
Well or moderately differentiated	7252/109	1.05 (0.84–1.32)	0.65
Poorly/undifferentiated	7252/268	0.95 (0.82–1.11)	0.54
P _{het}			0.47
Per 5 kg/m ² increase in BMI in young adulthood			
All participants (confounding adjustment sequentially)			
Unadjusted	5417/536	0.86 (0.69–1.07)	0.17
Adjusted for country	5417/536	0.86 (0.69–1.08)	0.19
Additionally adjusted for birth cohort	5417/536	0.87 (0.70-1.08)	0.21
Additionally adjusted for mutation status	5417/536	0.91 (0.73–1.13)	0.39
Additionally adjusted for menopausal status	5417/536	0.93 (0.76–1.16)	0.53
Additionally adjusted for parity and age at menarche	5210/516	0.92 (0.74–1.14)	0.42
By mutation status ^a			
BRCA1 carrier	3134/380	0.92 (0.71–1.18)	0.50
BRCA2 carrier	2283/156	1.00 (0.74–1.36)	0.99
Pinteraction			0.73
By menopausal status ^b			
Premenopausal	5417/67	1.34 (0.97–1.84)	0.07
Postmenopausal	3094/469	0.82 (0.65–1.04)	0.11
P interaction			0.01

HR hazard ratio, Cl confidence interval

^aAdjusted for principal components, birth cohort, country of enrolment, and menopausal status in weighted Cox model

^bAdjusted for principal components, mutation status, birth cohort, and country of enrolment

^cAdjusted for principal components, birth cohort, country of enrolment, mutation status, and menopausal status

^dIncludes endometrioid, mucinous, clear cell, and other histological types

Bolded lines refer to the model corresponding to our main results

likely to have anovulatory cycles and fertility issues, particularly when caused by polycystic ovarian syndrome (PCOS), and thus have an increased risk of ovarian cancer.^{40,41} The association of PCOS with ovarian cancer risk was mainly confined to premenopausal women.⁴² Some studies have suggested that *BRCA1/2* mutation carriers may have subclinical ovarian insufficiency, which could mediate the relationship between obesity-related infertility and increased ovarian cancer risk.⁴³ Obesity itself also creates a

proinflammatory state and adipocyte-secreted inflammatory markers have been implicated in ovarian cancer development.⁴⁴ Circulating levels of oestradiol, androgen, and progesterone have also been implicated in the risk of ovarian cancer.^{45,46} One study in *BRCA1/2* mutation carriers showed higher oestradiol levels during each menstrual cycle compared with non-carriers, supporting the potential role of sex hormones in ovarian tumorigenesis in this population.⁴⁷ Obese premenopausal women tend to have lower

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Breast cancer group	N/events	HR (95% CI)	P value	Heterogeneity (I ²
BMI-GS ^a				
All participants (confounding adjustment sequentially)			
Adjusted for principal components	22,588/2923	1.12 (0.87–1.45)	0.37	
Additionally adjusted for country	22,588/2923	1.11 (0.86–1.44)	0.41	
Additionally adjusted for birth cohort	22,588/2923	1.12 (0.87–1.45)	0.36	
Additionally adjusted for mutation status	22,588/2923	1.11 (0.86–1.42)	0.43	
Additionally adjusted for menopausal status	22,588/2923	1.10 (0.86–1.42)	0.44	
By mutation status ^b				
BRCA1 carrier	14,676/2319	1.16 (0.88–1.53)	0.31	
BRCA2 carrier	7912/604	0.81 (0.46-1.43)	0.46	
P _{interaction}			0.27	
By menopausal status ^c				
Premenopausal	22,588/967	1.59 (1.08–2.33)	0.02	
Postmenopausal	9219/1955	0.80 (0.58–1.11)	0.18	
Pinteraction			0.006	
By tumour subtype ^d				
Serous	20,978/892	0.92 (0.59–1.43)	0.71	
Non-serous	20,978/421	1.60 (0.83–3.08)	0.16	
P _{het}			0.17	
By tumour grade ^d				
Well or moderately differentiated	20,600/239	1.20 (0.52–2.75)	0.67	
Poorly/undifferentiated	20,600/696	0.74 (0.45–1.21)	0.23	
P _{het}			0.33	
Meta-analysis method ^e				
All participants	22,588/2923	1.12 (0.86–1.46)	0.39	15.9%
BRCA1 carrier	14,676/2319	1.18 (0.88–1.57)	0.26	17.2%
BRCA2 carrier	7912/604	0.80 (0.45–1.43)	0.45	0.0%
Pinteraction			0.24	
Two-stage residual inclusion method ^f				
All participants	7516/772	1.37 (0.84–2.24)	0.21	
BRCA1 carrier	4401/543	1.24 (0.67–2.27)	0.49	
BRCA2 carrier	3115/229	1.57 (0.67-3.66)	0.30	

HR hazard ratio, CI confidence interval, CIMBA Consortium of Investigators for the Modifiers of BRCA1/2

^aBMI-GS was constructed by combining 93 BMI-associated single-nucleotide polymorphisms (SNPs)

^bAdjusted for principal components, birth cohort, country of enrolment, and menopausal status in weighted Cox model

^cAdjusted for principal components, mutation status, birth cohort, and country of enrolment

^dAdjusted for principal components, mutation status, menopausal status, birth cohort, and country of enrolment

^eHazard ratios were calculated using inverse-variance meta-analysis and re-scaled to the corresponding units by calculating the height measurements per zscore among controls. Effect estimates for ovarian cancer for each SNP were calculated from weighted Cox model adjusting for principal components, birth cohort, country of enrolment, menopausal status, and mutation status

^fAnalysis was performed among 7516 participants with measured BMI

Bolded lines refer to the model corresponding to our main results

circulating levels of progesterone compared with normal weight women.⁴⁸ Higher progesterone levels may reduce ovarian cancer risk, through upregulation of p53, leading to tumour cell apoptosis.^{46,49-51} Taken together, these pathways may explain the association of higher BMI with premenopausal ovarian cancer risk. In addition, height has been associated with higher levels of circulating insulin-like growth factor-1 (IGF-1),^{52,53} a pathway that has been implicated in tumour transformation and may exert antiapoptotic and mitogenic effects.^{54,55} Moreover, BRCA1 may directly interact with the IGF-1 pathway to mediate cancer risk.⁵

Our study has several strengths, including large sample size, genetic scores utilising most identified height and BMI variants, several MR methods, and consistent findings between observed

and genetically predicted phenotypes. Several limitations of our study should be considered. First, even with a large sample size, the CIs for most risk estimates were wide, which limits inferences about causation. While both the height- and BMI-GS were clearly associated with their respective traits, they were only able to explain 13.4% and 2.6% of the variation, respectively. This reduced the statistical precision of our risk estimates. During the preparation of our manuscript, a new genome-wide meta-analysis⁵⁷ found a substantial number of new genetic loci related to height and BMI, increasing the amount of variation that could be explained for these two traits to 24.6% and 6.0%, respectively, although the variation that could be explained when examining these SNPs in a validation cohort was 14.0% and 2.3%. This is comparable to the

rs ID Chromo	Chromosome	hromosome Position Ne	Nearest gene	allele	Effect allele	Effect allele frequency in CIMBA	Imputation quality ^a	Association with ovarian cancer in CIMBA		
				in CIMBA	n CIMBA in CIMBA i			Log hazard ratio ^b	Standard error	P value
Height										
rs11049611	12	28600244	CCDC91	С	Т	0.28	1	0.127	0.036	0.0004
rs6902771	6	152157881	ESR1	С	Т	0.46	0.98	0.091	0.032	0.005
rs584828	17	38599230	IGFBP4	С	Т	0.39	0.68	0.109	0.040	0.006
rs3817428	15	89415247	ACAN	С	G	0.22	0.51	0.144	0.053	0.006
rs7517682	1	103519589	COL11A1	G	А	0.56	0.98	0.085	0.033	0.009
rs12470505	2	219908369	CCDC108	Т	G	0.10	0.97	-0.143	0.055	0.009
rs26024	5	127696022	FBN2	Α	С	0.34	1	-0.087	0.034	0.011
rs13113518	4	56399648	CLOCK	Т	С	0.37	0.99	0.081	0.033	0.014
rs7319045	13	92024574	GPC5	Α	G	0.61	0.92	0.084	0.035	0.017
rs2044124	17	61845425	CCDC47	Т	С	0.95	0.91	0.187	0.079	0.018
rs9309101	2	43629612	THADA	Α	G	0.35	1	0.076	0.033	0.021
rs11867943	17	54229842	ANKFN1	Α	Т	0.11	0.96	0.118	0.051	0.022
rs12779328	10	12943973	CCDC3	С	Т	0.30	0.94	-0.080	0.036	0.026
rs8073371	17	46096276	COPZ2	С	Т	0.20	1.00	-0.095	0.043	0.029
rs2013265	8	24092500	ADAM28	С	Т	0.22	0.62	0.104	0.047	0.029
rs11687941	2	242191410	HDLBP	С	G	0.26	0.96	-0.079	0.037	0.031
rs6838153	4	122720999	EXOSC9	Α	G	0.33	0.99	-0.072	0.034	0.033
rs7112925	11	66826160	RHOD	С	Т	0.36	0.95	-0.071	0.034	0.037
rs16942341	15	89388905	ACAN	С	Т	0.03	0.60	0.255	0.123	0.039
rs6080830	20	17771113	BANF2	Α	G	0.43	0.68	-0.080	0.039	0.041
rs867245	4	2218888	POLN	С	G	0.07	1.00	0.122	0.060	0.043
rs1155939	6	126866133	C6orf173	С	Α	0.51	0.99	0.064	0.033	0.049
BMI										
rs16851483	3	141275436	RASA2	G	Т	0.07	1	-0.203	0.068	0.003
rs2207139	6	50845490	TFAP2B	Α	G	0.16	0.99	0.120	0.043	0.005
rs2033732	8	85079709	RALYL	т	С	0.75	0.72	-0.088	0.042	0.037
rs6804842	3	25106437	RARB	А	G	0.58	0.58	0.087	0.044	0.046

Table 6. Height or body mass index (BMI) single-nucleotide polymorphisms (SNPs) statistically significantly associated (*P* < 0.05) with ovarian cancer risk in CIMBA

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^aImputation quality of 1 indicates genotyped SNPs

^bPer-allele association with ovarian cancer was adjusted for principal components, birth cohort, menopausal status, age at menopause, country of enrolment, and mutation status in weighted Cox models

amount of variation that could be explained using the set of genetic variants in our study. Including these additional SNPs may be able to improve the precision of our estimates for both height and BMI. Moreover, the inclusion of rare variants to strengthen the height and BMI genetic instruments should also be considered in future studies.⁵⁸ Our study did not explicitly examine whether adding height or BMI (either observed or genetically predicted) to existing polygenic risk scores for ovarian cancer could further refine risk prediction. Histology was only available in a subset of ovarian cancer patients, which limits our capacity to understand subtype-specific effects of BMI and height. Our study only included women of European ancestry, which may preclude generalisation to women of other racial/ethnic groups.

In summary, our study suggests that higher BMI may be causally associated with ovarian cancer risk in *BRCA1/2* carriers, possibly more so for premenopausal women. BMI could be used to identify premenopausal women at elevated risk of ovarian cancer. Our finding of a stronger association between BMI and non-serous ovarian cancer warrants confirmation in future studies.

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