No evidence for a causal relationship between cancers and Parkinson's disease

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34 Abstract

Background: Epidemiological data suggest that cancer patients have a reduced risk of subsequent
Parkinson's disease (PD) development, but the prevalence of PD in melanoma patients is often
reported to be increased. Causal relationships between cancers and PD have not been fully explored.

- **Objectives:** To study causal relationship between different cancers and PD.
- Methods: We used GWAS summary statistics of 15 different types of cancers and two-sample
 Mendelian randomization to study the causal relationship with PD.
- 41 **Results:** There was no evidence to support a causal relationship between the studied cancers and PD.
- We also performed reverse analyses between PD and cancers with available full summary statistics
 (melanoma, breast, prostate, endometrial and keratinocyte cancers) and did not find evidence of causal
 relationship.
- 45 Conclusions: We found no evidence to support a causal relationship between cancer and PD and the
 46 previously reported associations could be a result of genetic pleiotropy, shared biology or biases.

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49 Introduction

Parkinson's disease (PD) is a complex disorder, influenced by numerous environmental and 50 genetic factors. Observational studies have suggested associations between PD and different types of 51 cancers (lung, skin, pancreatic cancers and others) [1-7], such that cancer patients have lower risk of 52 subsequent PD development [8] and overall PD is associated with a reduced risk of subsequent cancer 53 development [1, 2]. However, risk of PD is increased in melanoma patients [9] and the prevalence of 54 melanoma and brain tumors may be increased in patients with PD [3-6]. In the absence of a causal 55 effect, apparent associations may be explained by confounding factors (such as toxins that casually 56 influence the risk of specific cancers and PD), shared genetic susceptibility or biological pathways, or 57 ascertainment bias [10, 11]. 58

In Mendelian randomization (MR), similar to randomized control trials, single-nucleotide 59 polymorphism (SNPs) are used to randomly divide participants into two groups defined by genotype, 60 assuming that genotype distribution is a random process during meiosis, and therefore it should not be 61 affected by confounders. MR uses SNPs associated with an exposure of interest (such as cancer 62 susceptibility) as proxies to determine the causal association between that exposure and an outcome 63 [12]. Summary level data from genome wide associational studies (GWASs) are used to construct 64 instrumental variables (IVs) from GWAS significant SNPs. In the current study, we performed bi-65 directional MR to examine whether certain types of cancers have causal relationships with PD and 66 vice versa. 67

68 Methods

69 Mendelian randomization

For the construction of genetic instruments, we selected studies from the GWAS Catalog [13] using
the R package MRInstruments [14, 15]. First, we searched for traits using keywords "cancer",

"carcinoma", "glioma", "lymphoma", "leukemia", "melanoma". We then selected the most recent available GWAS for each cancer, with a minimum of 1000 cases and at least the same number of controls of European ancestry. Additionally, recent GWASs on melanoma [16] and combined analysis of keratinocyte cancers [17] were added as they were not available in the GWAS catalog. Fifteen studies were selected for this part of the analysis (**Supplementary Table 1**). UK biobank (UKB) participants were included in some of these studies (colorectal cancer, combined analysis of keratinocyte cancers, endometrial cancer, lung cancer, melanoma, uterine fibroids).

To perform MR in the reverse direction (the causal relationship between PD and different cancer types) we required full summary statistics which we obtained through GWAS Catalog or direct contact with authors. We were able to collect full summary statistics for melanoma [16], breast [18], prostate [19], endometrial [20] and keratinocyte cancers (basal cell and squamous cell carcinoma) [17].

We used GWAS summary statistics from the latest PD GWAS excluding 23andMe and UKB
data, to avoid potential bias due to overlapping samples [21]. After the exclusions, a total of 15,056
PD patients and 12,637 controls were included in the summary statistics [21].

We constructed genetic instruments for cancer susceptibility and PD using SNPs with GWAS 86 significant *p*-values ($<5 \times 10^{-8}$) from each study. The extracted data included rs-numbers, log odds 87 ratios, standard errors, p-values, alleles, and effect allele frequency. SNPs for each exposure were 88 clumped using standard parameters (clumping window of 10,000 kb, r² cutoff 0.001) to discard 89 variants in LD. Additionally, we calculated r^2 , which reflects the proportion of variability explained 90 91 by genetic variants and F-statistics to estimate the strength of IVs selected for exposures as previously 92 described [22, 23]. We calculated estimated power to detect an equivalent effect size of OR 1.2 on PD 93 risk utilizing online Mendelian randomization calculation an power (https://sb452.shinyapps.io/power/) [24]. 94

MR methods implemented in the Two-sample MR R package [14, 15] were used and are 95 described in detail elsewhere [25-27]. Firstly, we performed Steiger filtering to exclude SNPs that 96 97 explain more variance in the outcome than in the exposure [15]. We then used the inverse variance weighted (IVW) method, in which we pooled estimates from individual Wald ratios for each SNP and 98 meta-analyzed using random effects [25-27]. We applied MR Egger to detect net directional pleiotropy 99 and provide a better estimate of the true causal effect allowing to detect possible violations of 100 101 instrumental variable assumptions [27]. Additionally, we used weighted median (WM) which is a median of the weighted estimates and provides consistent effect even if 50% of IVs are invalid [28]. 102 103 These sensitivity analyses were performed to explore heterogeneity and horizontal pleiotropy. Heterogeneity was tested using Cochran's Q test in the IVW and MR-Egger methods [29]. For each 104 method, we constructed funnel plots to detect pleiotropic outliers (Supplementary Figure 1-6). 105 106 Additionally, we performed MR-PRESSO test to detect outlier SNPs which may be biasing estimates through horizontal pleiotropy, and then adjust for them [30]. 107

108 Data availability:

109 All code used in the current study is available at <u>https://github.com/gan-orlab/MR_Cancers-PD</u>

110 **Results**

111 Mendelian randomization does not support a causal role for different cancers and PD

We selected 15 cancer GWAS studies for MR analysis (**Table 1**). The variance in the exposure variables explained by SNPs ranged from 0.016 to 0.059 (**Table 2**). All instruments had F-statistics of >10, which is the standard cut-off applied to indicate sufficient instrument strength (**Table 2**; **Supplementary Table 1**).

116 No causal effect of any cancer on PD was observed applying various MR methods (Table 1;
117 Supplementary Table 1, Supplementary Figure 1-2).

To test for potential violations of MR assumptions, we performed sensitivity analyses. Significant heterogeneity was apparent for cutaneous squamous cell carcinoma (IVW, Q *p*-value=0.02) and combined analysis of keratinocyte cancers (MR Egger, Q *p*-value=0.012; IVW, Q *p*-value=0.012, **Supplementary Table 2, Supplementary Figure 3**).

Tests for pleiotropy were performed to detect SNPs affecting the outcome through alternative 122 123 pathways. There was some evidence for net horizontal pleiotropy for brain tumors (p=0.011) and cutaneous squamous cell carcinoma (p=0.029, Supplementary Table 2) which may have resulted in 124 bias to IVW estimates, but the slopes from Egger regression were imprecisely estimated. Using MR-125 PRESSO, we detected an outlier SNP for cutaneous squamous cell carcinoma (rs4710154). The 126 distortion test did not suggest significant changes in the effect estimates after this outlier was removed 127 128 (Supplementary Table 2). The sensitivity analyses revealed no clear evidence for bias in the IVW estimate due to invalid instruments with other cancers. 129

130 Additionally, we performed reverse MR with melanoma, keratinocyte, prostate, endometrial and breast cancers for which we had full summary statistics using PD-associated SNPs as exposure 131 and cancer summary statistics as outcome and did not find any evidence for causal relationships 132 (Supplementary Table 3; Supplementary Figure 4-6). We found evidence for directional pleiotropy 133 between PD and breast cancer and keratinocyte cancers, and a borderline distortion test with MR-134 PRESSO for breast cancer (Supplementary Table 3). MR-PRESSO identified an outlier SNP for both 135 136 PD and breast and prostate cancer (rs4630591). Additionally, the rs510306 SNP was found to be an outlier for prostate cancer. For keratinocyte cancers, three outlier SNPs were detected (rs4630591, 137 rs6599388 and rs4889603). 138

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140 Discussion

141 In the current study, we performed a comprehensive analysis to examine whether the reported 142 associations between different cancers (**Table 1**) and PD may be causal. Our results provide no

evidence to support causal effects, and indicate that the observed associations may be due to other 143 reasons including shared biology, confounders or biases. MR methods have limited availability and 144 145 statistical power to differentiate horizontal and vertical pleiotropy, but high power to detect pleiotropy itself. Although MR can help reduce confounding and the possibility of reverse causality, a recent 146 147 study demonstrated that MR is not immune to survival bias [31]. PD is an age-related disease and inverse observational study associations may occur spuriously if the exposure of interest (here cancer) 148 149 causes premature mortality. This situation is known as 'survivor bias' and can occur in case-control 150 settings, including in MR studies. On the other hand, early mortality from cancer could reduce cancer 151 prevalence in PD [8]. The higher occurrence of brain cancers in PD might be related to closer medical attention (i.e., more frequent MRI in PD patients compared to the general population). 152

153 The most thoroughly studied genetic relationship between cancer and PD is for melanoma [32]. Previous MR studies did not demonstrate evidence of a causal relationship between PD and melanoma 154 [22]. However, a recent, comprehensive analysis suggested a significant genetic correlation between 155 156 melanoma and PD, with gene expression overlap [10], that could probably explain the increased frequency of melanoma in PD. One of the possible explanations for the link between cancers and PD 157 is pleiotropy. In our study, we only examined causality using MR and did not estimate possible shared 158 159 biology. To study possible shared biology, methods such as linkage disequilibrium score regression and transcriptome wide association study can be used to examine correlations between two traits 160 161 occurring through shared genetic architecture. Unfortunately, we were only able to collect full summary statistics of mostly sex-specific cancers (prostate, breast, endometrial cancers), which cannot 162 be used with the PD GWAS data since it is not sex-stratified. This approach should be used in future 163 164 studies. We cannot rule out that pleiotropic effects within the IVs cancel out each other if they have effects in opposite direction. There are genes involved in pathogenesis of both PD and cancers. It was 165 suggested that familial PD genes (PINK1, DJ1, LRRK2 etc.) may play a role in cancers [33-35]. 166

167 *GPNMB* variants were associated with PD [36] and overexpression of GPNMB have been 168 demonstrated in PD as well as in various cancers including melanoma [37, 38].

169 In our analyses using MR-PRESSO, we identified a few outlier SNPs. For cutaneous squamous cell carcinoma and PD, the rs4710154 SNP, located near the FGFR10P gene, was an outlier. This 170 gene was previously implicated in skin cancer and in several inflammatory disorders including Crohn's 171 172 disease [39]. This SNP was not previously associated with PD. Another outlier SNP, rs4630591, near the KANSL1 gene (encoding for KAT8 Regulatory NSL Complex Subunit 1) was identified for PD 173 and breast and prostate cancers. This gene has been previously reported as the first cancer 174 predisposition fusion gene [40], and this SNP was associated with breast cancer in transcriptome wide 175 association study [41]. The rs510306 SNP near the IGSF9B gene has not been previously implicated 176 177 in prostate cancer. For PD and keratinocyte cancers, three outlier SNPs were detected (rs4630591, rs6599388 and rs4889603). The rs6599388 SNP is located in TMEM175 and rs4889603 is located in 178 179 STX1B, both of which have not been previously associated with skin cancers.

Our study has several limitations. This is a European-based study, and these associations or 180 lack thereof should be studied in other populations. We excluded UKB data to decrease the chance of 181 overlapping samples between studies, which can result in bias. As a result, some of our MR analyses 182 might have not enough power to detect the causal effect. Lack of availability of sex-specific PD GWAS 183 data is the another limitation, which would be important for studying the causal effect of sex-specific 184 185 cancers, or with cancers that have meaningful sex differences [42]. We performed bi-directional MR with PD and cancers with available full summary statistics (melanoma, breast, prostate, endometrial 186 and keratinocyte cancers) and did not find evidence of a causal relationships. One more limitation is 187 188 that MR relies on the quality of the GWAS used for the MR, and thus, limited by the GWAS quality.

Additionally, we could not consider in the current analysis important environmental exposures that would be of interest for stratified analyses (e.g. smoking in lung cancer; hormone levels in sexdriven cancers). Thus, it is possible that we missed some causal effects due to gene-environmentinteraction or imperfect phenotype consideration.

To conclude, our results do not support a causal relationship between the tested cancers and PD, and suggest that the observed associations could be a result of genetic pleiotropy, shared biology or biases. Once larger datasets become available, as well as sex-specific PD datasets, additional MR studies should be performed on cancers and PD.

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 highlight genetic background shared by various cancers and hormone-related traits. *Nat Commun* 9,
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643 Table 1. List of all cancer GWAS studies selected for Mendelian randomization analysis

		Replication sampleInitial sample sizesize					
Trait	Study	Cases	Controls	Cases	Controls		
	Michailidou et al.,						
Breast cancer	2017[18]	76,192	63,082	46,785	70,064	100.00%	
Chronic							
lymphocytic	Law et al.,						
leukemia	2017[43]	4,478	13,213	1,722	4,385	80.70%	
Colorectal	Law et al.,						
cancer	2019[44]	31,197	61,770	-	-	38%	
Cutaneous							
squamous cell	Chahal et al.,						
carcinoma	2016[45]	6579	280,558	825	11,518	74.50%	
Combined							
analysis of							
keratinocyte	Liyanage et al.,						
cancers	2019[17]	31,787	619,351	-	-	63.00%	
Endometrial	O'Mara et al.,						
cancer	2018[20]	12,906	108,979	-	-	71.50%	
	McKay et al.,						
Lung cancer	2017[46]	23,223	16,964	-	-	71.50%	
	Sud et al.,						
Lymphoma	2017[47]	1,278	14,325	1,586	3,069	90.60%	
	Landi et al.,						
Melanoma	2020[16]	36,760	375,188	-	-	68.30%	
Non-							
glioblastoma	Melin et al.,						
glioma/Glioma	2017[48]	12,469	18,190	-	_	93.10%	
Oral cavity and							
pharyngeal	Lesseur et al.,						
cancer	2016[49]	6,009	6,585	-	-	95.60%	
Pancreatic	Klein et al.,						
cancer	2018[50]	9,040	12,496	2,737	4,752	82.80%	
	Schumacher et					57.00%	
Prostate cancer	al., 2018[19]	79,148	61,106	-	-		
Renal cell	Scelo et al.,					71.50%	
carcinoma	2015[51]	10,784	20,406	3,182	6,301		
	Rafnar et al.,	10,704	20,400	3,102	0,301		
Uterine fibroids	2018[52]	16,595	52,3330			64.90%	
oterme inproids	2010[32]	10,393	52,3330	-	-		

Table 2. MR analysis between exposure (cancers) and outcome (PD).

			F-		MR Egger	r	Inverse	Inverse variance weighted				
	N, SNPs		statistic						0			
Exposure	included	r^2	S	b	se	pval	b	se	pval			
Breast cancer	107	0.016	38.5	0.075	0.065	0.247	0.032	0.033	0.337			
Chronic												
lymphocytic												
leukemia	7	0.035	106.11	0.047	0.640	0.944	0.099	0.077	0.197			
Colorectal												
cancer	35	0.02	53.8	-0.002	0.273	0.994	0.042	0.057	0.460			
Cutaneous												
squamous cell												
carcinoma	23	0.03	405.2	-0.097	0.077	0.223	0.051	0.048	0.288			
Combined												
analysis of												
keratinocyte	F 0	0.000		0.010	0.050	0 500	0.015	0.001	0.506			
cancers	68	0.023	216.6	-0.018	0.053	0.732	0.017	0.031	0.586			
Endometrial	12	0.020	071 4	0.100	0.252	0 (01	0.014	0.050	0.000			
cancer	13	0.028	271.4	-0.106	0.252	0.681	-0.014	0.059	0.808			
Lung cancer	10	0.029	120.4	0.000	0.121	0.999	0.049	0.053	0.355			
Lymphoma	5	0.047	236.2	0.325	0.288	0.341	-0.013	0.068	0.845			
Melanoma	45	0.026	244.37	-0.035	0.053	0.507	-0.002	0.032	0.950			
Non-												
glioblastoma	10	0.050	00.02	0.100	0.040	0.050	0.021	0.000	0.256			
glioma/Glioma	19	0.052	88.03	0.102	0.049	0.052	-0.021	0.023	0.356			
Oral cavity and												
pharyngeal cancer	4	0.059	198.2	0.008	0.376	0.986	0.094	0.064	0.144			
Pancreatic	4	0.039	190.2	0.008	0.570	0.960	0.094	0.004	0.144			
cancer	16	0.037	68.9	-0.221	0.152	0.168	0.003	0.041	0.934			
Prostate cancer	74	0.037	38.9	-0.221	0.152	0.130	-0.022	0.041	0.443			
Renal cell	/ 4	0.02	50.7	0.071	0.000	0.150	0.022	0.020	0.773			
carcinoma	8	0.028	148.02	-0.145	0.241	0.569	-0.031	0.084	0.707			
Uterine		2.323							51101			
fibroids	18	0.024	732.5	0.164	0.185	0.388	-0.014	0.073	0.854			

PD, Parkinson's disease; N, number; r², proportion of variance in exposure variable explained by
 SNPs; F, statistics 'strength' of the genetic instrumental variable; b, beta; se, standard error, pval, p value.

							Inve	rse var	iance							
	Ν,		F-	MR Egger			weighted			Simple mode			Weighted mode			
Exposure	SNPs	R2	statistics	b				se	pval	b	se	pval	b	se	pval	
Breast cancer	107	0.016	38.5	0.08	0.06	0.25	0.03	0.03	0.34	-0.01	0.13	0.92	0.01	0.07	0.84	
Chronic																
lymphocytic																
leukemia	7	0.035	106.11	0.05	0.64	0.94	0.10	0.08	0.20	-0.03	0.15	0.87	-0.03	0.12	0.83	
Colorectal cancer	35	0.02	53.8	0.00	0.27	0.99	0.04	0.06	0.46	-0.13	0.19	0.51	-0.16	0.18	0.37	
Cutaneous																
squamous cell																
carcinoma	23	0.03	405.2	-0.10	0.08	0.22	0.05	0.05	0.29	0.19	0.11	0.09	0.00	0.06	0.99	
Combined analysis																
of keratinocyte	68															
cancers		0.023	216.6	-0.02	0.05	0.73	0.02	0.03	0.59	-0.02	0.08	0.78	0.00	0.04	1.00	
Endometrial																
cancer	13	0.028	271.4	-0.11	0.25	0.68	-0.01	0.06	0.81	-0.04	0.12	0.73	0.04	0.11	0.73	
Lung cancer	10	0.029	120.4	0.00	0.12	1.00	0.05	0.05	0.36	0.04	0.12	0.74	0.08	0.08	0.35	
Lymphoma	5	0.047	236.2	0.33	0.29	0.34	-0.01	0.07	0.85	-0.02	0.11	0.85	-0.03	0.10	0.79	
Melanoma	45	0.026	244.37	-0.04	0.05	0.51	0.00	0.03	0.95	-0.07	0.09	0.40	-0.05	0.04	0.31	
Non-glioblastoma																
glioma/Glioma	19	0.052	88.03	0.10	0.05	0.05	-0.02	0.02	0.36	-0.05	0.06	0.43	-0.02	0.04	0.57	
Oral cavity and																
pharyngeal cancer	4	0.059	198.2	0.01	0.38	0.99	0.09	0.06	0.14	0.18	0.12	0.22	0.17	0.11	0.22	
Pancreatic cancer	16	0.037	68.9	-0.22	0.15	0.17	0.00	0.04	0.93	-0.02	0.10	0.88	0.02	0.08	0.82	
Prostate cancer	74	0.02	38.9	-0.09	0.06	0.13	-0.02	0.03	0.44	-0.07	0.08	0.36	0.00	0.05	0.94	
Renal cell																
carcinoma	8	0.028	148.02	-0.15	0.24	0.57	-0.03	0.08	0.71	0.12	0.18	0.52	0.13	0.13	0.34	
Uterine fibroids	18	0.024	732.5	0.16	0.19	0.39	-0.01	0.07	0.85	0.12	0.19	0.54	0.15	0.15	0.34	

Suplementary Table 1. MR analysis between exposure (cancers) and outcome (PD)

R2- proportion of variance in exposure variable explained by SNPs; F-statistics 'strength' of the genetic instrumenral variable b- beta; sestandart error, pval - p-value

			Hetero	ogeneity tests	Test for directional horizontal pleiotropy						
				Inverse							MR-PRESSO
	MR			variance			egger			MR-PRESSO	distortion
	Egger			weighted			intercept	se	pval	global	test
Exposure	Q	Q_df	Q_pval	Q	Q_df	Q_pval				pval	pval
Breast cancer	115.83	105	0.22	116.51	106	0.23	0.00	0.01	0.43	0.18	NA
Chronic lymphocytic											
leukemia	8.09	5	0.15	8.10	6	0.23	0.01	0.10	0.94	0.25	NA
Colorectal cancer	34.79	33	0.38	34.82	34	0.43	0.00	0.02	0.87	0.37	NA
Cutaneous squamous											
cell carcinoma	29.94	21	0.09	37.73	22	0.02	0.03	0.01	0.03	0.01	0.14
Combined analysis of											
keratinocyte cancers	94.79	66	0.01	95.76	67	0.01	0.01	0.01	0.41	0.01	NA
Endometrial cancer	5.50	11	0.91	5.64	12	0.93	0.01	0.03	0.72	0.94	NA
Lung cancer	8.34	8	0.40	8.56	9	0.48	0.01	0.02	0.66	0.43	NA
Lymphoma	3.23	3	0.36	4.79	4	0.31	-0.08	0.07	0.32	0.39	NA
Melanoma	54.34	43	0.12	55.13	44	0.12	0.01	0.01	0.43	0.11	NA
Non-glioblastoma											
glioma/Glioma	9.37	17	0.93	17.57	18	0.49	-0.04	0.01	0.01	0.30	NA
Oral cavity and											
pharyngeal cancer	4.48	2	0.11	4.60	3	0.20	0.02	0.09	0.84	0.02	NA
Pancreatic cancer	11.44	14	0.65	13.78	15	0.54	0.04	0.03	0.15	0.50	NA
Prostate cancer	57.22	70	0.86	58.98	71	0.85	0.01	0.01	0.19	0.82	NA
Renal cell carcinoma	8.97	6	0.18	9.35	7	0.23	0.02	0.03	0.63	0.20	NA
Uterine fibroids	22.90	16	0.12	24.46	17	0.11	-0.02	0.02	0.31	0.12	NA

Supplementary Table 2. Heterogeneity tests and tests for directional horizontal pleiotropy between Cancers and PD

Q- Cochran's Q test, df- degrees of freedom, se- standart error, pval- p-value, NA for distortion test if non outliers were available

And Subset And Subset Image Ima Image Image	[1															
Outcome SNPs b se pval b se pval b se pval b se pval Breast cancer 15 0.01 0.06 0.82 0.02 0.02 0.33 0.04 0.02 0.08 -0.02 0.03 0.59 0.00 0.02 0.86 Endometrial cancer 15 0.03 0.10 0.78 -0.04 0.31 -0.02 0.04 0.54 0.04 0.08 0.66 0.04 0.67 Melanoma 14 0.00 0.66 0.99 -0.01 0.03 0.64 0.02 0.02 0.47 -0.01 0.05 0.81 0.05 0.03 0.99 0.00 0.02 0.88 0.02 0.40 <t< th=""><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th><th></th></t<>																	
SNPs SNPs Se pval b se pval se	Outcome	N, MR Egger Weighter						nedian	Inverse variance	e weigl	nted	S	imple mode		Weighted mode		
cancer 15 0.01 0.06 0.82 0.02 0.02 0.38 0.04 0.02 0.08 -0.02 0.00 0.05 0.00 0.02 0.86 Endometrial cancer 15 0.00 0.01 0.78 0.04 0.04 0.31 0.002 0.04 0.54 0.04 0.00 0.06 0.04 0.47 Melanoma 14 0.00 0.06 0.99 0.01 0.03 0.64 0.02 0.02 0.47 0.00 0.00 0.05 0.81 0.07 0.04 0.74 Prostate cancer 15 0.03 0.03 0.04 0.03 0.02 0.88 0.02 0.02 0.40 0.03 0.99 0.00 0.31 0.00 0.02 0.40 0.03 0.99 0.00 0.03 0.91 0.00 0.00 0.03 0.91 0.00 0.00 0.03 0.91 0.00 0.02 0.03 0.92 0.40 0.00 0.03 0.91 0.00 0.00 0.03 0.91 0.00 0.00 0.03	oucome	SNPs	b	se	pval	b	se	pval	b	se	pval	b	se	pval	b	se	pval
Cancer 15 I<	Breast		0.01	0.06	0.00	0.02	0.02	0.20	0.04	0.02	0.00	0.02	0.02	0.50	0.00	0.02	0.96
cancer 15 -0.03 0.10 0.78 -0.04 0.01 0.04 0.04 0.04 0.04 0.04 0.04 0.04 0.04 0.08 0.06 0.08 0.06 0.04 0.07 Melanoma 14 0.00 0.06 0.99 -0.01 0.03 0.64 0.02 0.02 0.47 -0.01 0.05 0.81 0.07 0.04 0.74 Prostate cancer 15 -0.08 0.05 0.01 0.03 0.62 0.02 0.02 0.47 0.00 0.04 0.00 0.01 0.05 0.01 0.74 0.74 Prostate cancer 15 0.05 0.01 0.03 0.02 0.02 0.02 0.40 0.00 0.03 0.91 0.00 0.04 0.99 0.00 0.03 0.91 0.05 0.05 0.04 0.09 0.03 0.92 0.03 0.91 0.03 0.91 0.03 0.91 0.03 0.91 0.03 0.91 0.03 0.91 0.03 0.91 0.03 0.91 0.01	cancer	15	0.01	0.00	0.82	0.02	0.02	0.56	0.04	0.02	0.08	-0.02	0.05	0.59	0.00	0.02	0.80
cancer 15 .<	Endometrial		0.02	0.10	0.70	0.04	0.04	0.21	0.02	0.04	0 5 4	0.04	0.00	0.00	-	0.00	0.47
Melanoma Image: concent biase in the concent biase intervale interem biase in the concent biase in the concent bias	cancer	15	-0.03	0.10	0.78	-0.04	0.04	0.31	-0.02	0.04	0.54	0.04	0.08	0.66	0.04	0.06	0.47
Melanoma Image: concent biase in the concent biase intervale interem biase in the concent biase in the concent bias		1.4	0.00	0.00	0.00	0.01	0.02	0.04	0.02	0.02	0 47	0.01	0.05	0.01	-	0.04	0.74
cancer 15 -0.08 0.05 0.01 0.02 0.02 0.08 0.02 0.02 0.02 0.02 0.02 0.02 0.02 0.02 0.02 0.02 0.02 0.02 0.03 0.02 0.03 0.02 0.03 0.02 0.03 0.02 0.03 0.02 0.03 0.02 0.03 0.02 0.03	Melanoma	14	0.00	0.06	0.99	-0.01	0.03	0.64	0.02	0.02	0.47	-0.01	0.05	0.81	0.01	0.04	0.74
cancer 15 $\begin{tabular}{ c c c c c c c } \hline cl c c c c c c c c c c c c c c c c c c $	Prostate		0.09	0.05	0.12	0.00	0.02	0.00	0.02	0.02	0.40	0.00	0.04	0.00	0.00	0.02	0.00
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	cancer	15	-0.08	0.05	0.13	0.00	0.02	0.88	0.02	0.02	0.40	0.00	0.04	0.99	0.00	0.03	0.98
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	Keratinocvte		0.05												0.40		
Outcome SNPs Q Q_df Q_pval Q Q_df Q_pval Q_qdf Q_pval PRESSO distortion test Breast cancer 15 49.72 13 0.00 50.38 14 0.00 0.00 0.01 0.68 <0.001		15	0.05	0.08	0.55	0.04	0.03	0.24	0.00	0.03	0.91	0.08	0.06	0.22	0.10	0.04	0.02
N, Outcome N, SNPs Q Q_df Q_pval Q Q_df Q_pval Q_pval Q_pval Q_pval <									Test for c	Test for directional horizontal pleiotropy							11
N, OutcomeN, SNPsQQ_dfQ_mode <t< th=""><th></th><th></th><th colspan="4"></th><th></th><th></th><th></th><th>MR-</th><th>MR-PRESSO</th><th></th><th></th><th></th><th></th></t<>										MR-	MR-PRESSO						
N, OutcomeN, SNPsQQ_dfQ_pvalQQ_dfQ_pvalQQ_dfQ_pvalQ_pvalegger_interceptsepvalpvalpvalBreast cancer1549.72130.0050.38140.000.000.010.68<0.001						Inve	erse var	iance				PRESSO	distortion				
N, OutcomeN, SNPsQQ_dfQ_pvalQQ_dfQ_pvalQ_pvalQ_pvalpvalpvalBreast cancer1549.72130.0050.38140.000.000.010.68<0.001										global	test						
Breast cancer1549.72130.0050.38140.000.000.010.68<0.001												0					
cancer1549.72130.0050.38140.000.000.010.68<0.01	Outcome	SNPs	Q	Q_df	Q_pval	Q	Q_df	Q_pval	egger_intercept	se	pval	pval	pval				
cancer 15 $\begin{tmmatrix} & \begin{tmmatrix} & \begin{tmmatrix}$	Breast		49 72	13	0.00	50 38		0.00	0.00	0.01	0.68	<0.001	0.05				
cancer1521.80130.0621.81140.080.000.020.950.07NAMelanoma1412.62120.4012.70130.470.000.010.780.51NAProstate cancer1520.29130.0927.29140.020.020.010.780.050.020.02Keratinocyte cancers1538.22130.0039.35140.00-0.010.010.55<0.0010.60	cancer	15	45.72	15	0.00	50.50	14	0.00	0.00	0.01	0.00	<0.001	0.05				
cancer 15 a <t< th=""><th>Endometrial</th><th></th><th>21.80</th><th>13</th><th>0.06</th><th>21 81</th><th>1/</th><th>0.08</th><th>0.00</th><th>0.02</th><th>0 95</th><th>0.07</th><th>NΔ</th><th></th><th></th><th></th><th></th></t<>	Endometrial		21.80	13	0.06	21 81	1/	0.08	0.00	0.02	0 95	0.07	NΔ				
Prostate cancer 15 20.29 13 0.09 27.29 14 0.02 0.01 0.05 0.02 0.02 0.22 Keratinocyte cancers 15 38.22 13 0.00 39.35 14 0.00 -0.01 0.01 0.55 <0.02	cancer	15	21.00	15	0.00	21.01	14	0.08	0.00	0.02	0.95	0.07					
cancer 15 20.29 13 0.09 27.29 14 0.02 0.01 0.05 0.02 0.02 0.22 Keratinocyte cancers 15 38.22 13 0.00 39.35 14 0.00 -0.01 0.01 0.55 <0.02	Melanoma	14	12.62	12	0.40	12.70	13	0.47	0.00	0.01	0.78	0.51	NA				
cancer 15 Image: Concers 15 Image: Concers Image:	Prostate		20.20	12	0.00	27.20	1./	0.02	0.02	0.01		0.02	0.22				
cancers 15 38.22 13 0.00 39.35 14 0.00 -0.01 0.01 0.55 <0.001	cancer	15	20.29	13	0.09	27.29	14	0.02	0.02	0.01	0.05	0.02	0.22				
cancers 15 13 14	Keratinocyte		20.22		0.00	20.25		0.00	0.01	0.01	0.55	<0.001	0.00				
h hata sa standart arran nyal in yalua						39.35	14	0.00	-0.01	0.01	0.55	<0.001	0.60]			

Suplementary Table 3. Reverse MR analysis between exposure (Parkinson's disease) and outcome (cancers)

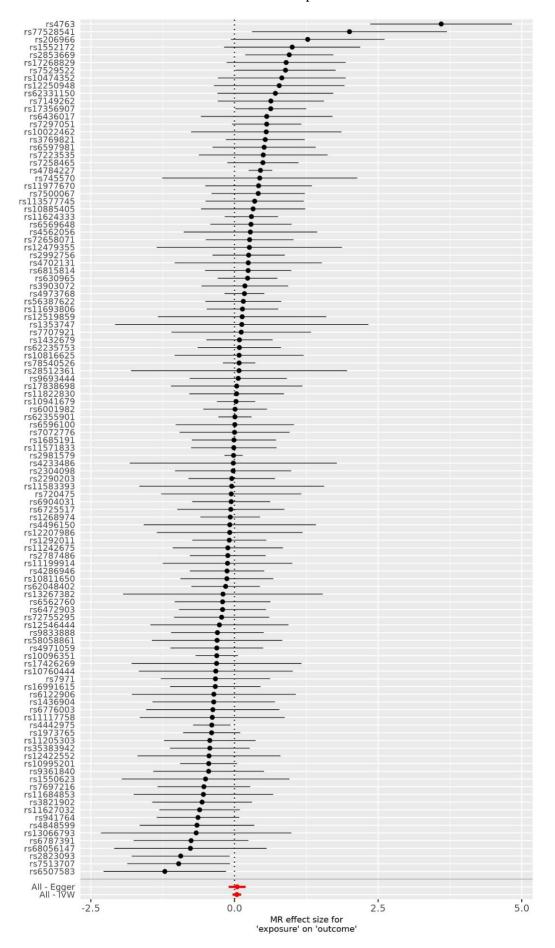
b- beta; se- standart error, pval - p-value

Supplementary Figure 1. Forest plots showing point estimates of the exposures of interest, Exposure of interest at the top of each forest
plot2
Supplementary Figure 2. Plots showing point estimates of the exposures of interest; Exposure of interest at the top of each
plot
Supplementary Figure 3. Funnel plots evaluated the presence of possible heterogeneity across the estimates. Exposure of interest at the top of each plot
Supplementary Figure 4. Reverse MR (PD as exposure; Cancers as outcome). Forest plots showing point estimates of the exposures of interest, Exposure of interest at the top of each forest plot
Supplementary Figure 5. Reverse MR (PD as exposure; Cancers as outcome). Plots showing point estimates of the exposures of interest; Exposure of interest at the top of each plot
Supplementary Figure 6. Reverse MR (PD as exposure; Cancers as outcome). Funnel plots evaluated the presence of possible heterogeneity across the estimates. Exposure of interest at the top of each plot

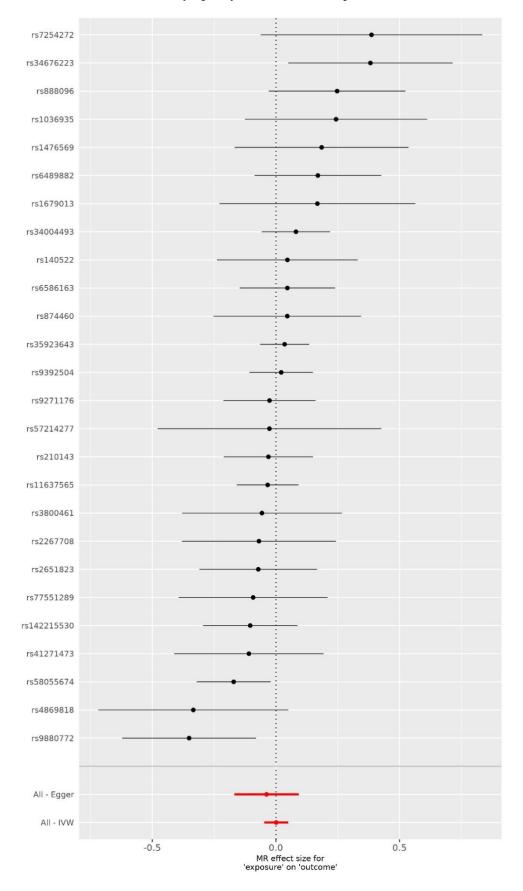
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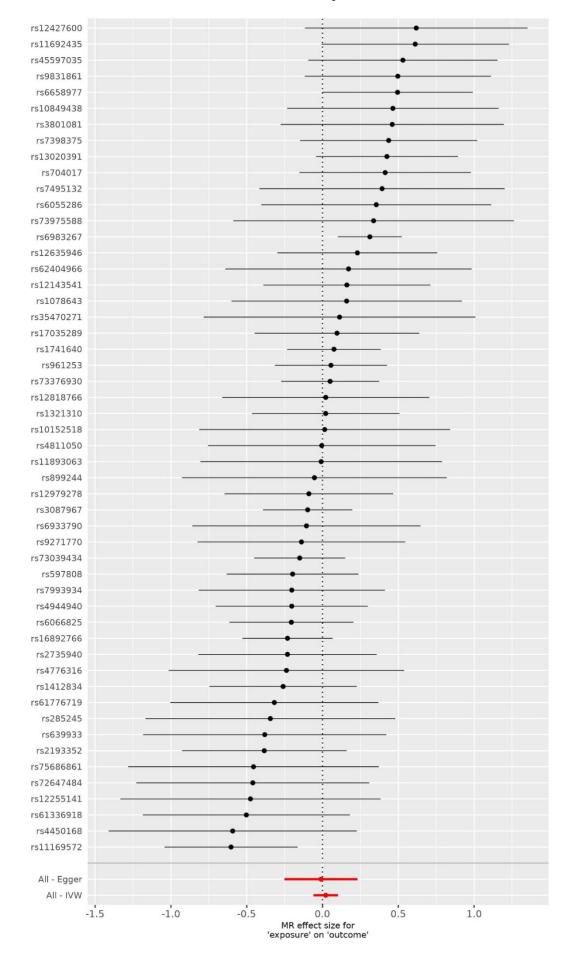
Supplementary Figure 1. Forest plots showing point estimates of the exposures of interest, Exposure of interest at the top of each forest plot.

Black points represent log-odds ratio of each SNP on the risk of PD. Red points represent the log-odds ration when combining all SNPs together (Inverse variance weighted and MR Egger methods). Lines from points represent 95% confidence intervals.

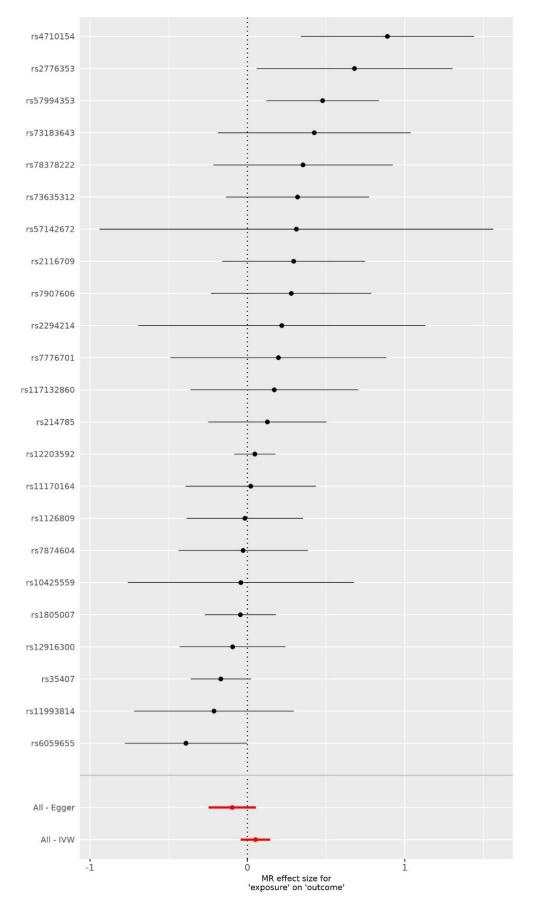


Chronic lymphocytic leukemia as exposure

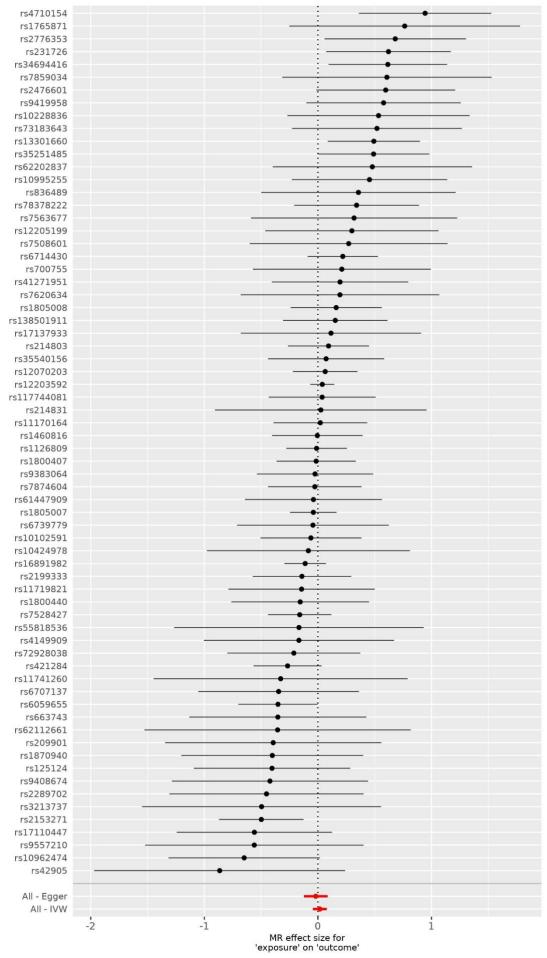




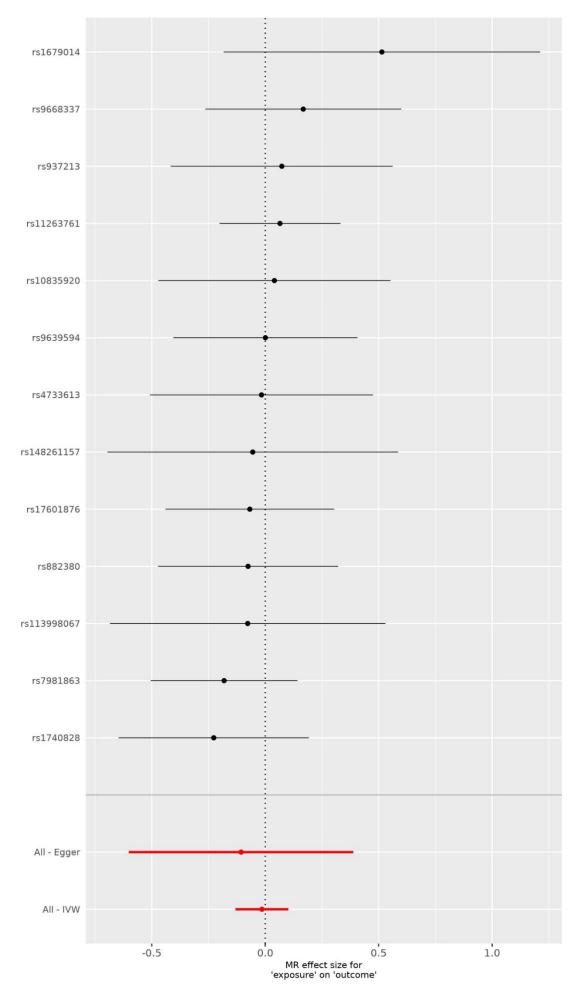
Cutaneous squamous cell carcinoma as exposure



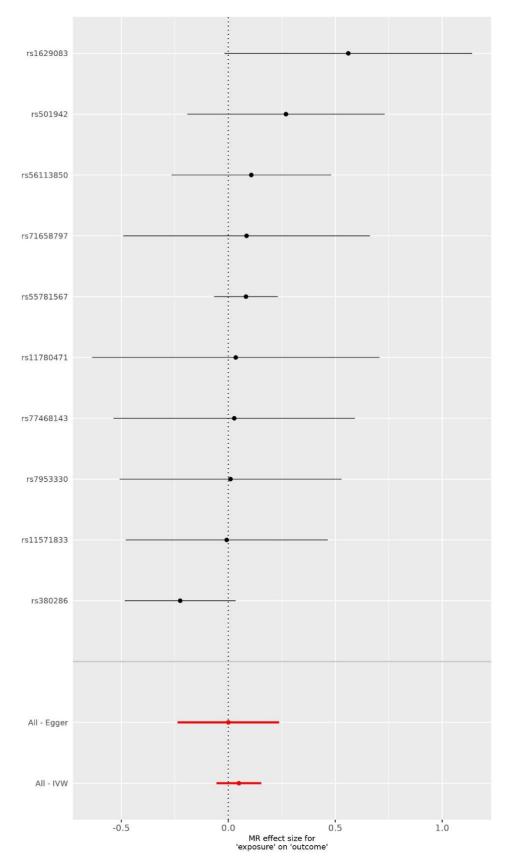
Combined analysis of keratinocyte cancers as exposure



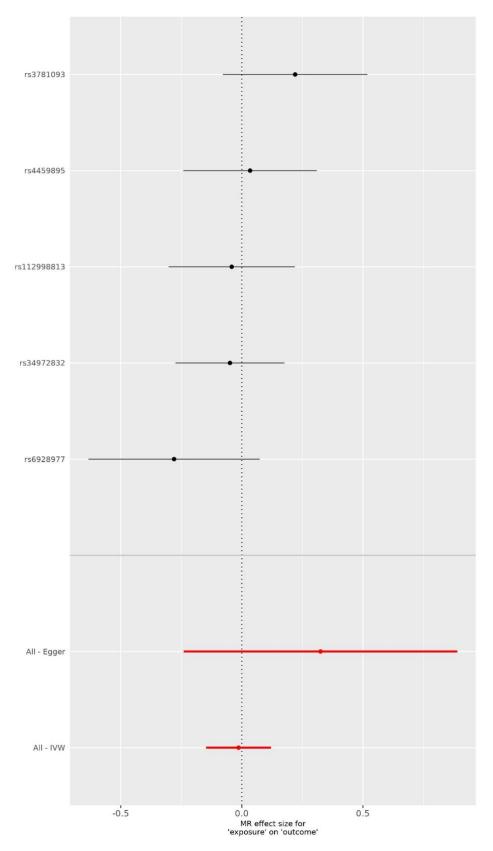
Endometrial cancer as exposure



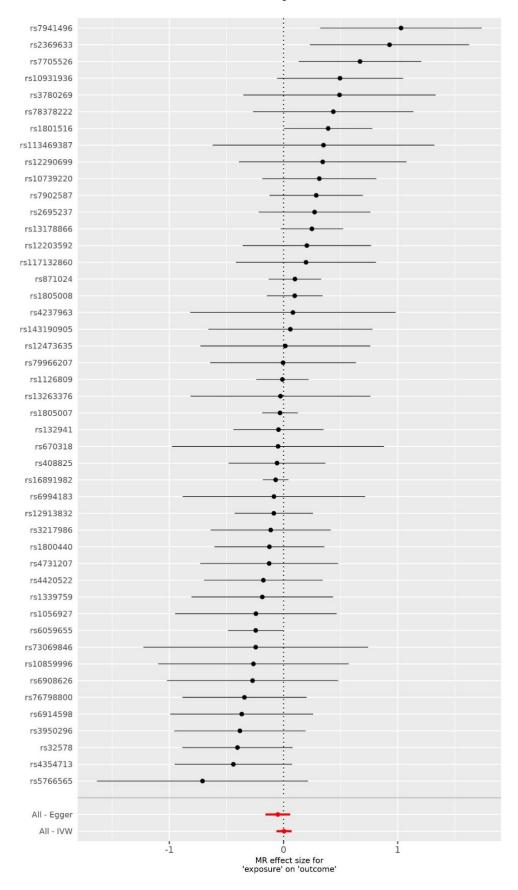
Lung cancer as exposure



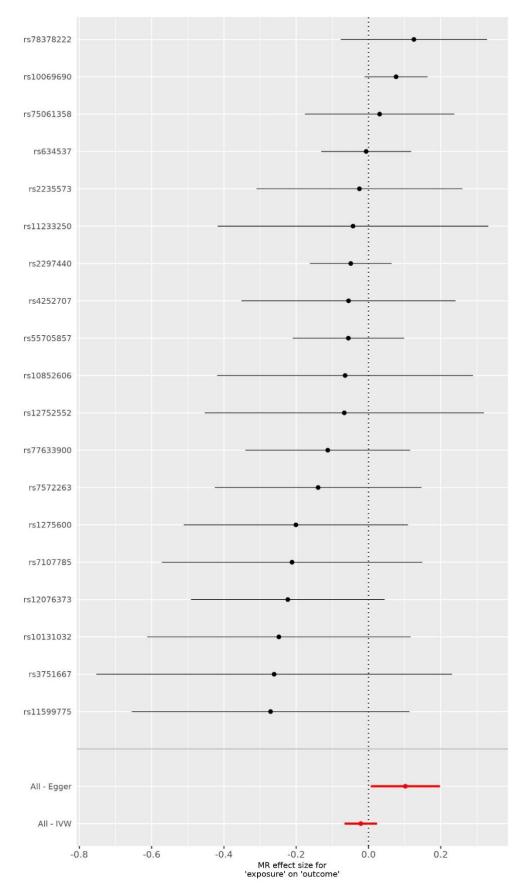
Lymphoma as exposure



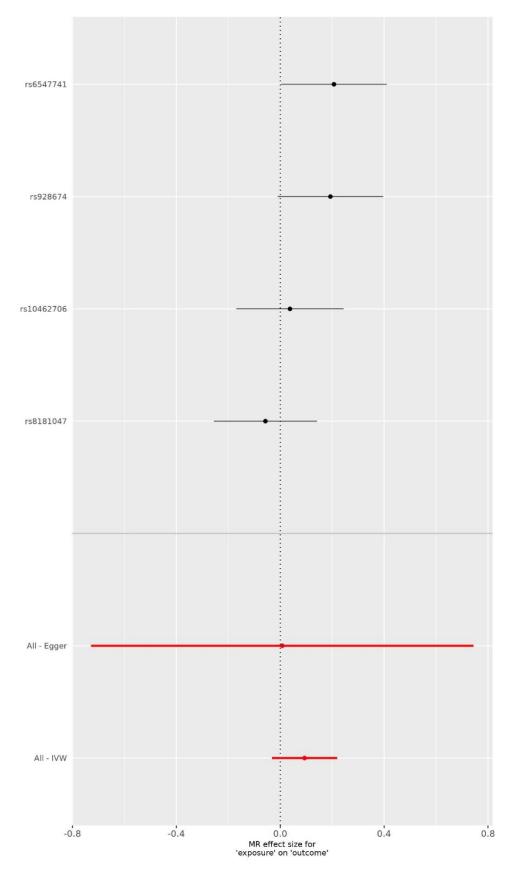
Melanoma as exposure



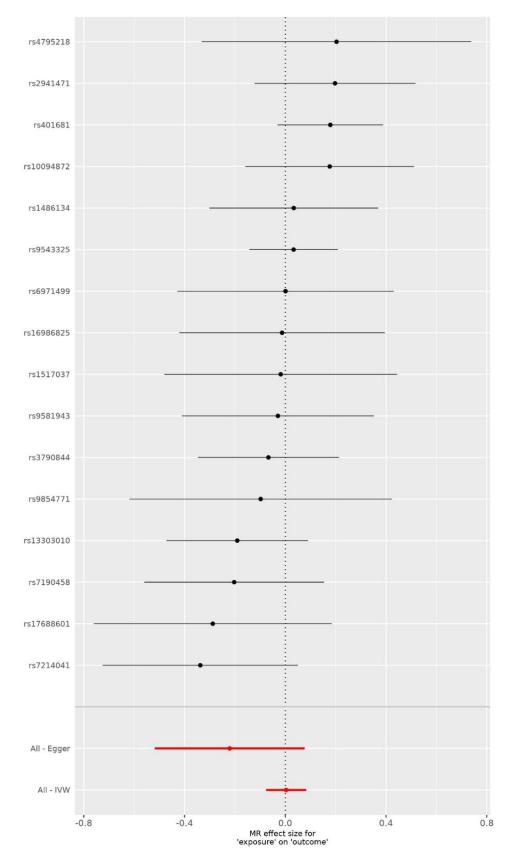
Non-glioblastoma glioma/glioma as exposure



Oral cavity and pharyngeal cancer as exposure



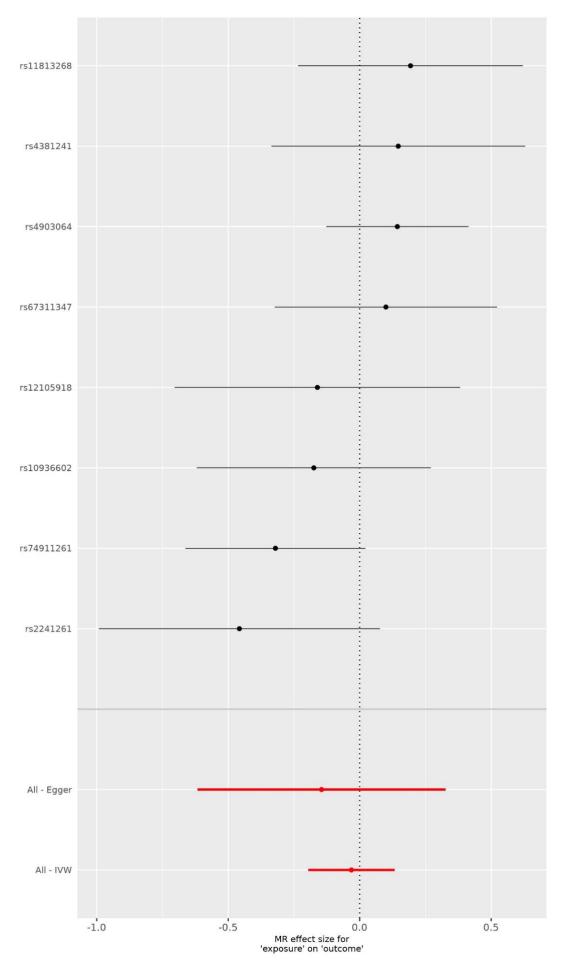
Pancreatic cancer



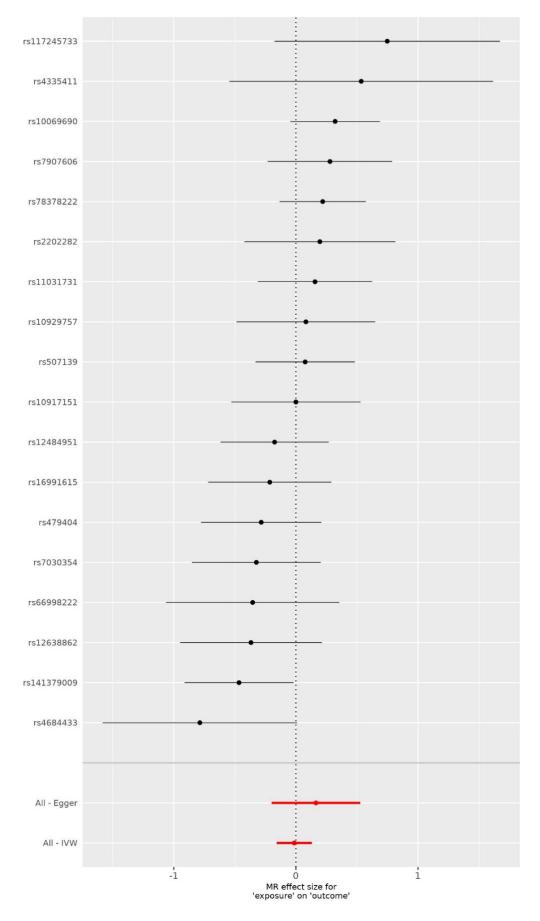
Prostate cancer

rs62106670	
rs17599629	
rs10793821	
rs11691517	
rs1218582	
rs1182	•
rs2680708	
rs7141529	
rs4924487	
rs1270884	• • • • • • • • • • • • • • • • • • •
rs2121875	
rs1004030	
rs1894292	
rs10845938	• • • • • • • • • • • • • • • • • • •
rs56232506	
rs1881502	
rs9625483	
rs7127900	
rs4245739	
rs4711748	
rs9364554	
rs2928679	
rs1859962	
rs10934853	
rs9287719	
rs12785905	
rs3850699	
rs11650494	
rs10993994	
rs2735839	
rs4430796	
rs9306895	•
rs10486567	•
rs8102476	
rs684232	
rs7931342	
rs7968403	• • • • • • • • • • • • • • • • • • •
rs2427345	
rs12956892	
rs1465618	
rs7679673	
rs17021918	
rs1447295	
rs8008270	
rs2660753	
rs80130819	
rs1933488	
rs11135910	• :
rs28441558	
rs4962416	
rs10936632	
rs10460109	• •
rs902774	
rs3771570	
rs5759167	
rs11666569	
rs721048	
rs4713266	• • • • • • • • • • • • • • • • • • •
rs58133635	
rs12621278	
rs6465657	
rs4976790	
rs2242652	
rs74702681	• • • • • • • • • • • • • • • • • • • •
rs1048169	• • • • • • • • • • • • • • • • • • •
rs33984059	
rs11863709	
rs6062509	
rs11214775	
rs7241993	
rs17621345	
rs2273669	
rs1935581	
rs7295014	
All - Egger	
All - IVW	
	-2 -1 0 1 2
	MR effect size for
	'exposure' on 'outcome'

Renal cell carcinoma



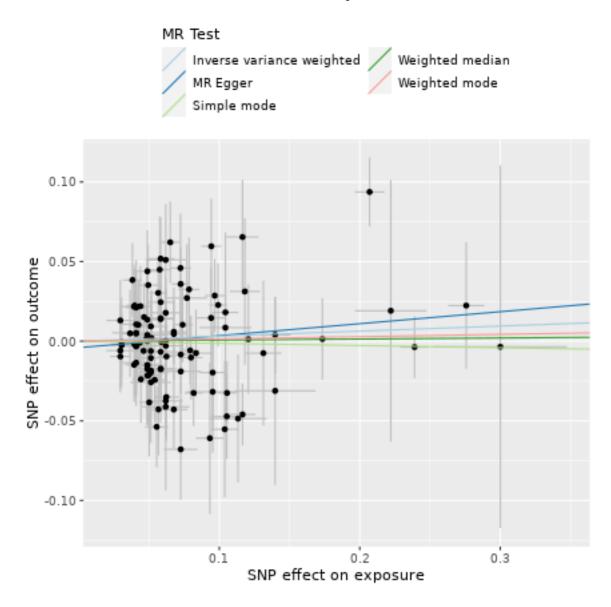
Uterine fibroids



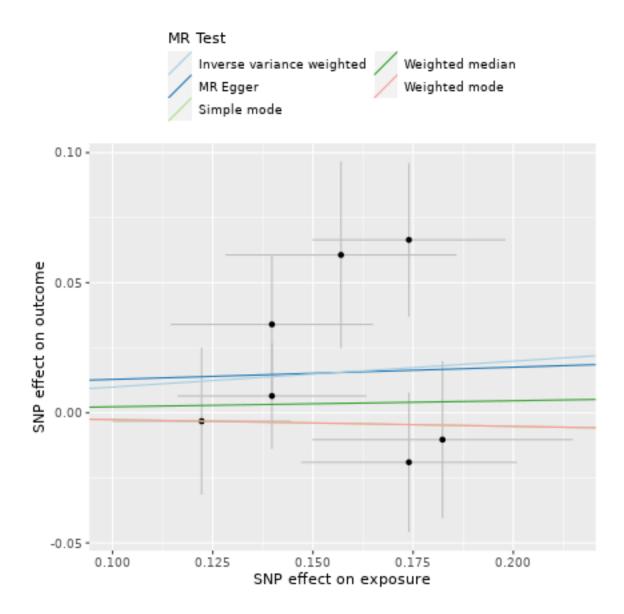
Supplementary Figure 2. PD without UKBB. Plots showing point estimates of the exposures of interest; Exposure of interest at the top of each plot.

A plot relating the effect sizes of the SNP-exposure association and the SNP-outcome associations with standard error bars. Lines correspond to causal estimates using each of the methods.

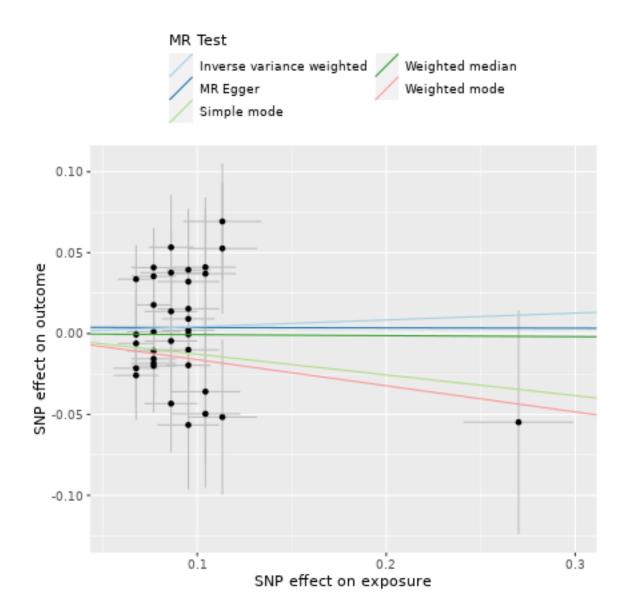
Breast cancer as exposure



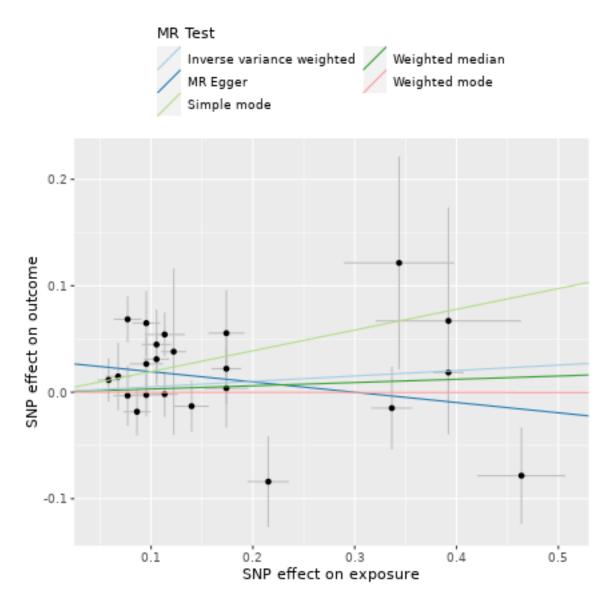
Chronic lymphocytic leukemia as exposure



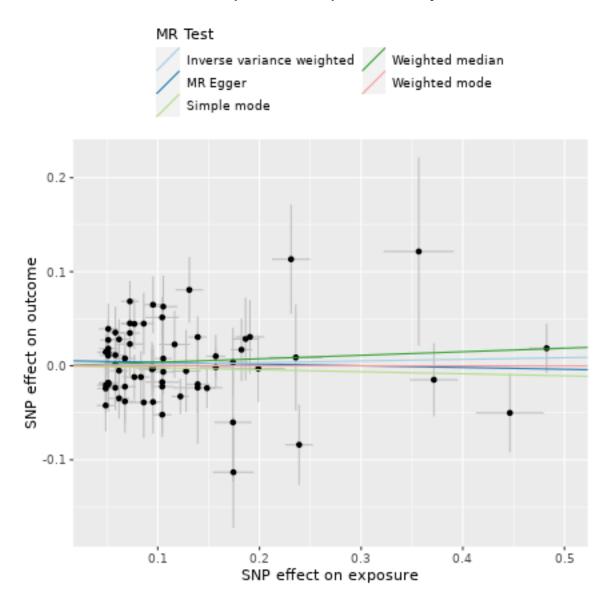
Colorectal cancer as exposure



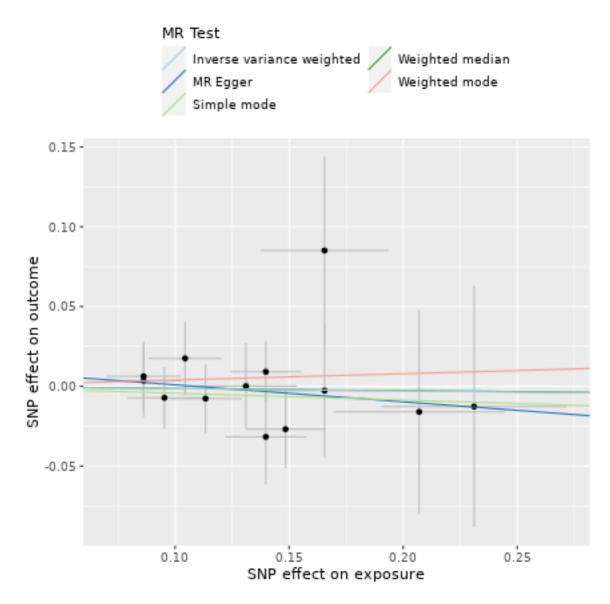
Cutaneous squamous cell carcinoma as exposure



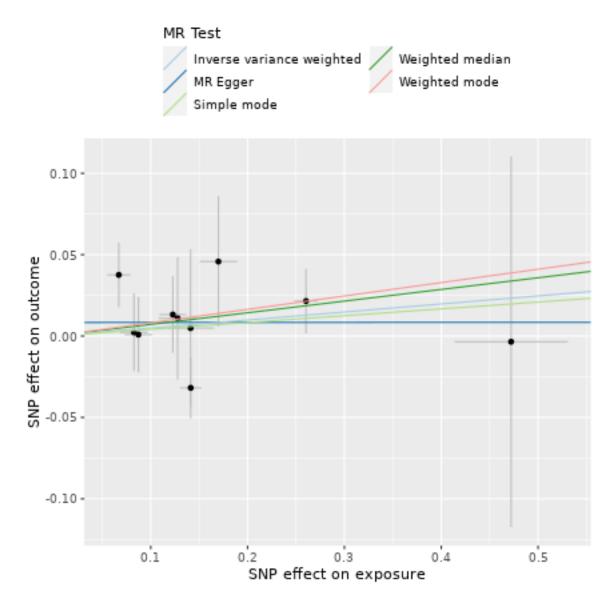
Combined analysis of keratinocyte cancers as exposure



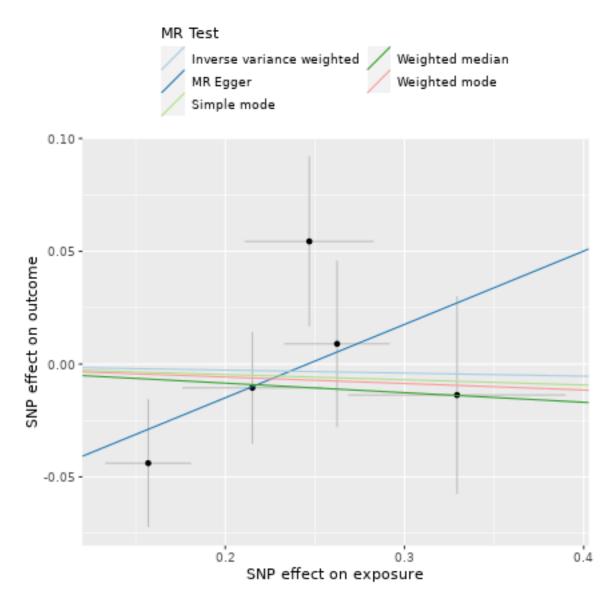
Endometrial cancer as exposure



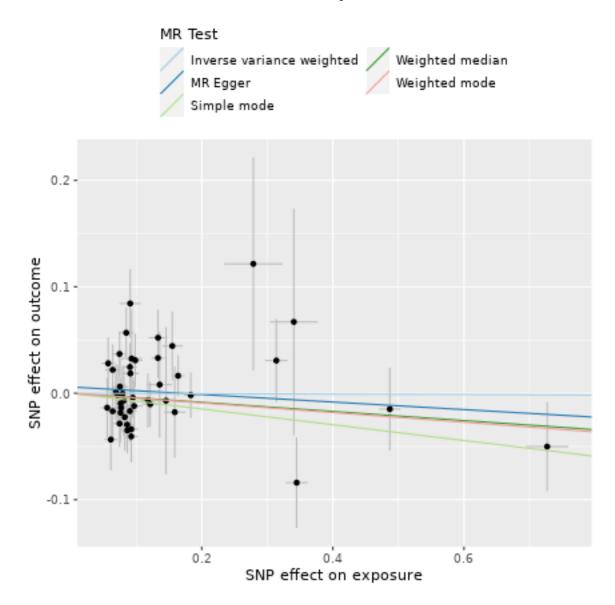
Lung cancer as exposure



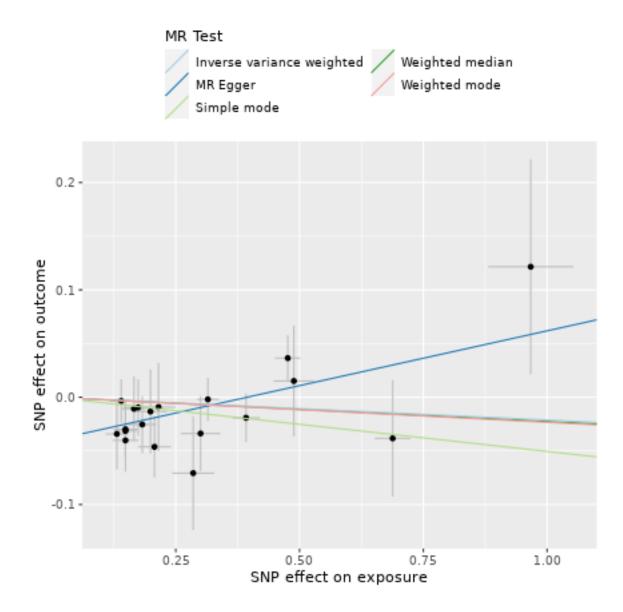
Lymphoma as exposure



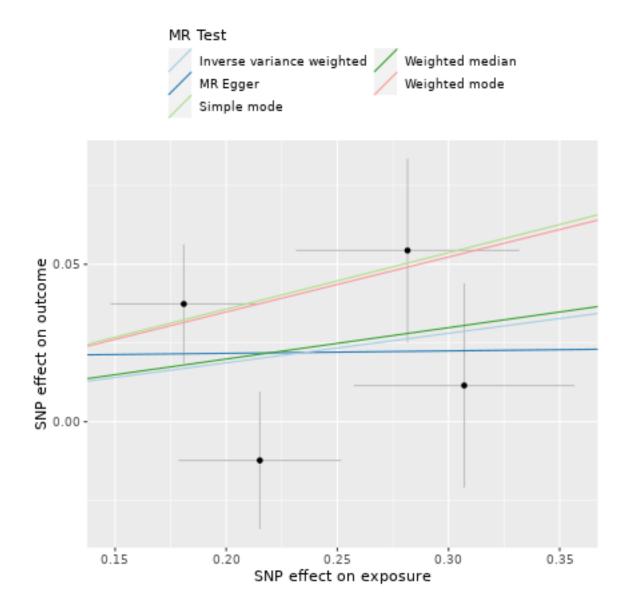
Melanoma as exposure



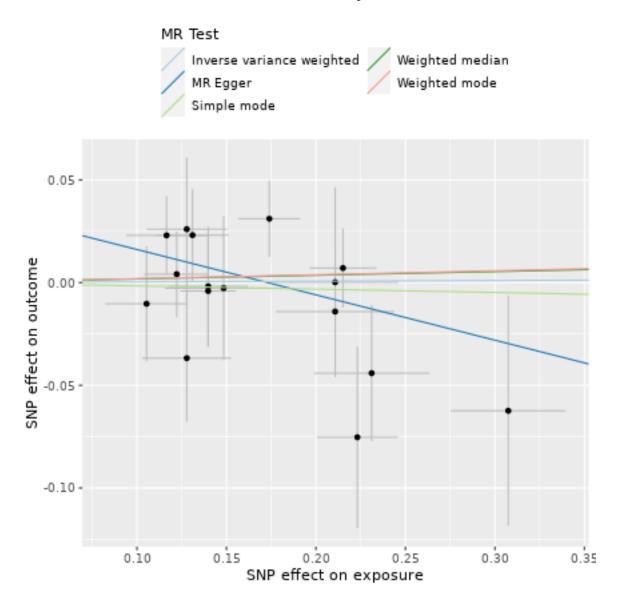
Non-glioblastoma glioma/Glioma as exposure



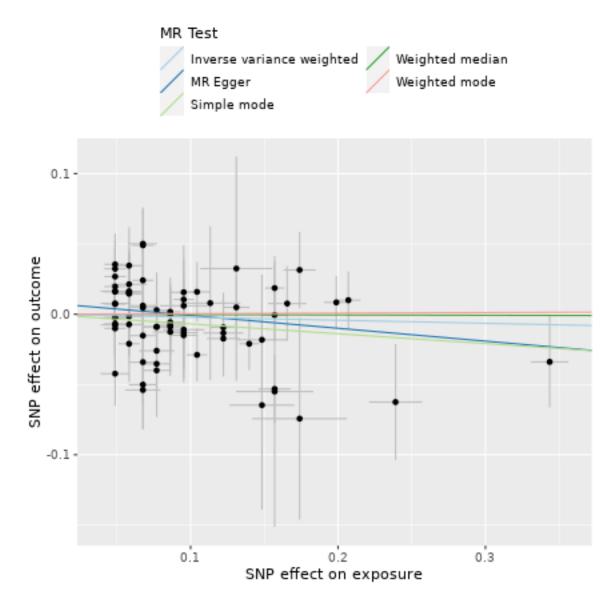
Oral cavity and pharyngeal cancer as exposure



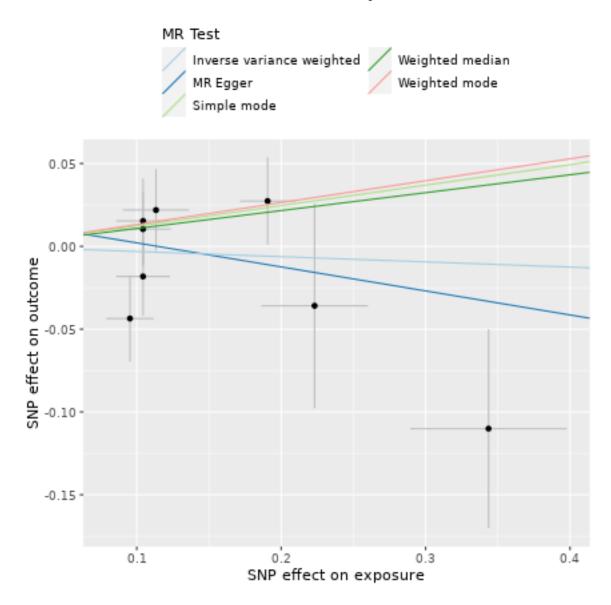
Pancreatic cancer as exposure



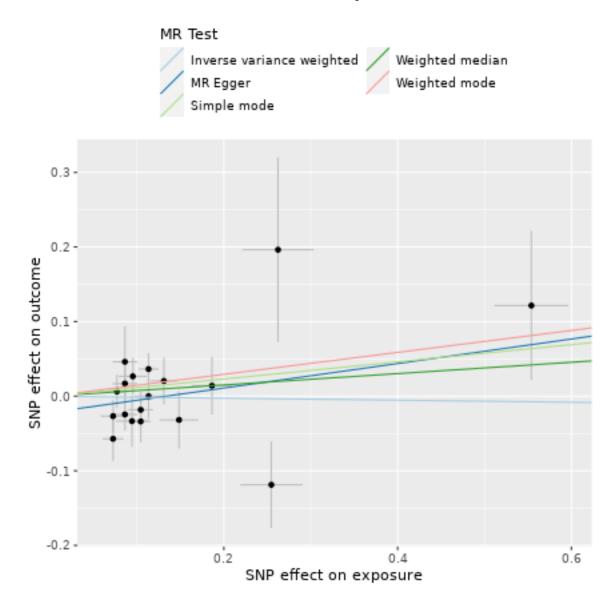
Prostate cancer as exposure



Renal cell carcinoma as exposure

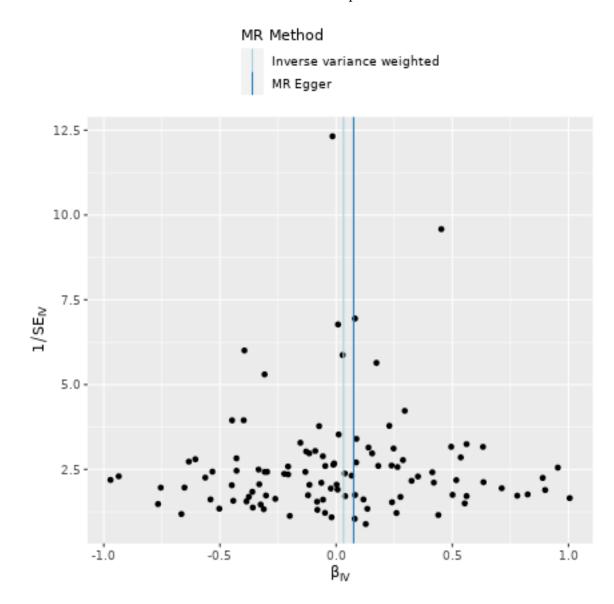


Uterine fibroids as exposure

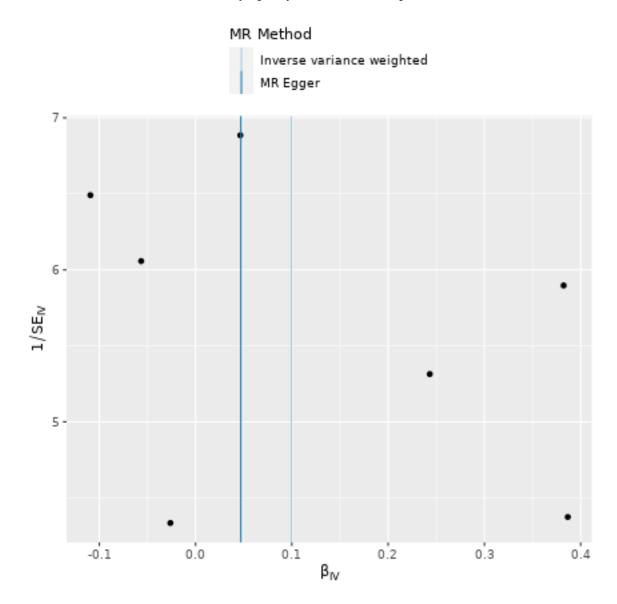


Supplementary Figure 3. PD without UKBB. Funnel plots evaluated the presence of possible heterogeneity across the estimates. Exposure of interest at the top of each plot. Each SNPs represented by dots. Inverse variance weighted and MR Egger method averaged causal effect of all SNPs.

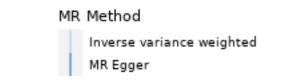
Breast cancer as exposure

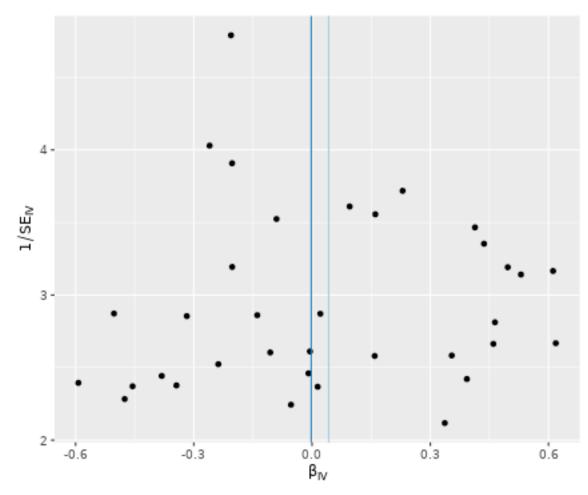


Chronic lymphocytic leukemia as exposure

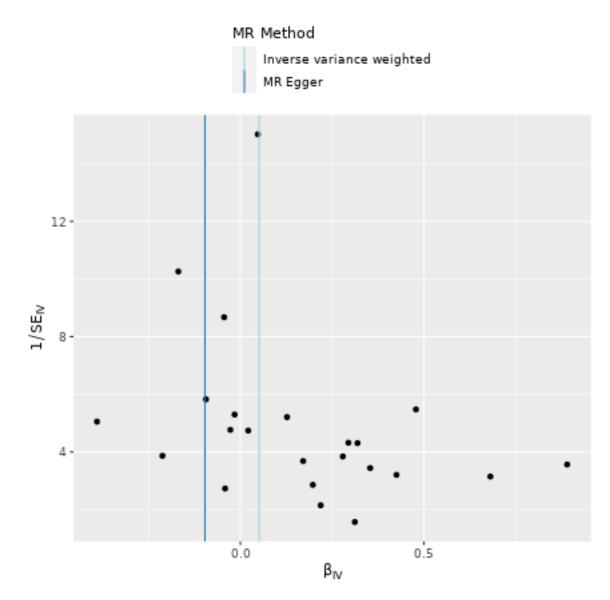


Colorectal cancer as exposure

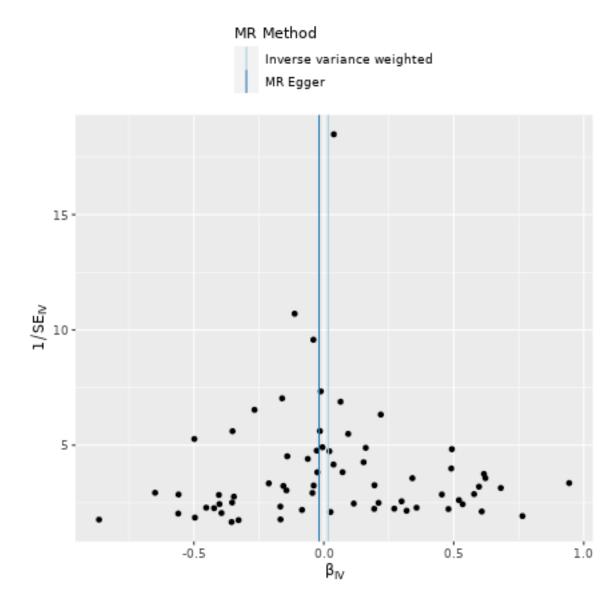




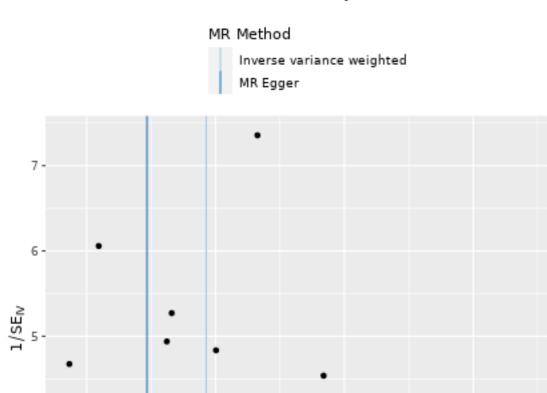
Cutaneous squamous cell carcinoma as exposure



Combined analysis of keratinocyte cancers as exposure



Endometrial cancer as exposure



4 -

3 -

-0.2

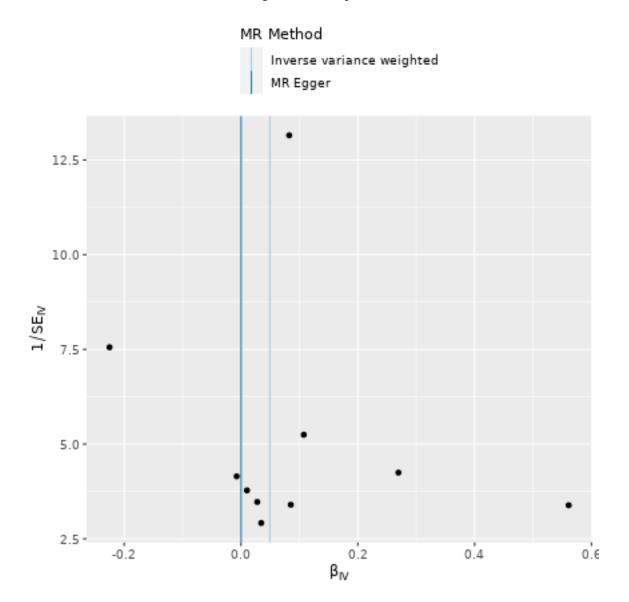
0.0

0.2

β_{IV}

0.4

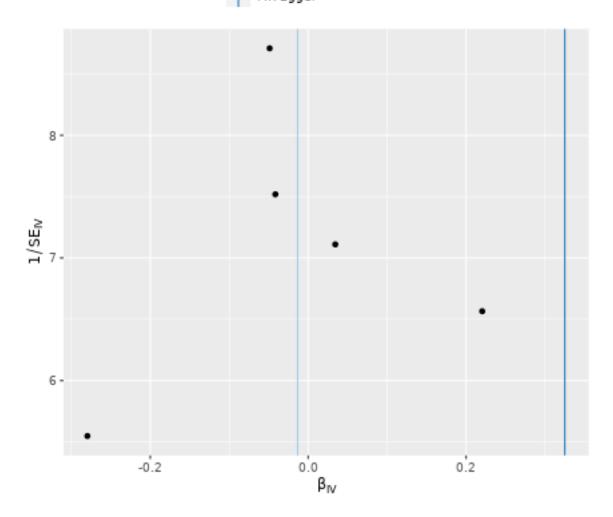
Lung cancer as exposure



Lymphoma as exposure

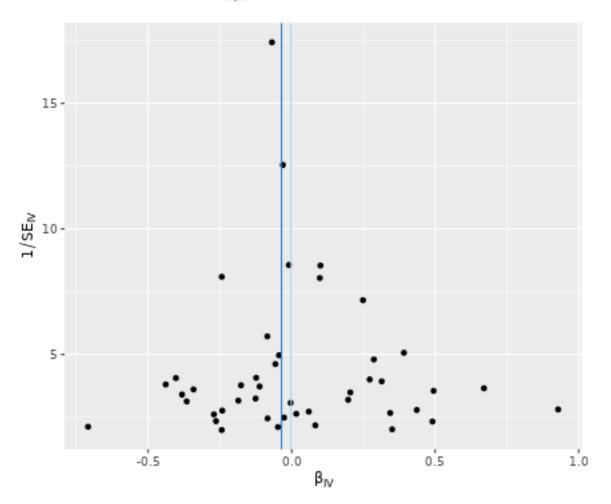


Inverse variance weighted MR Egger

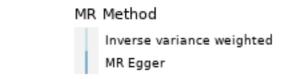


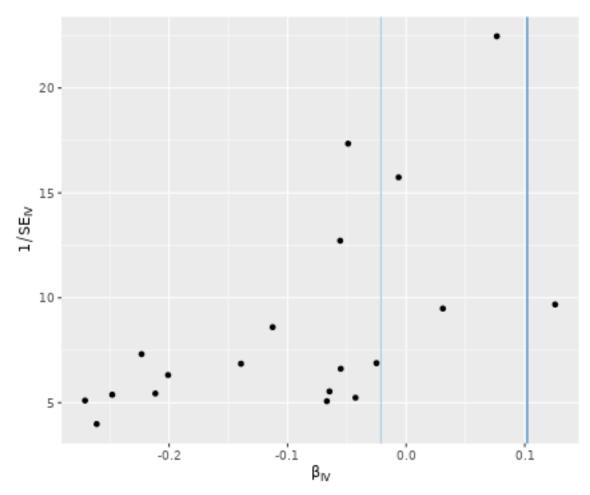
Melanoma as exposure

MR Method Inverse variance weighted MR Egger

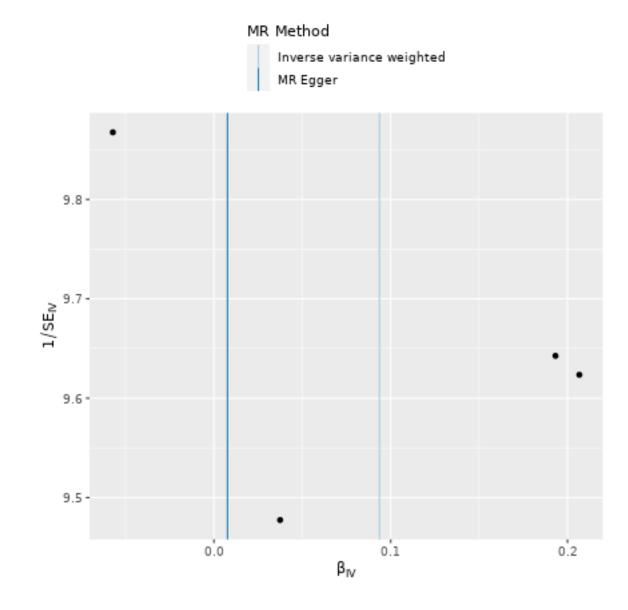


Non-glioblastoma glioma/Glioma as exposure

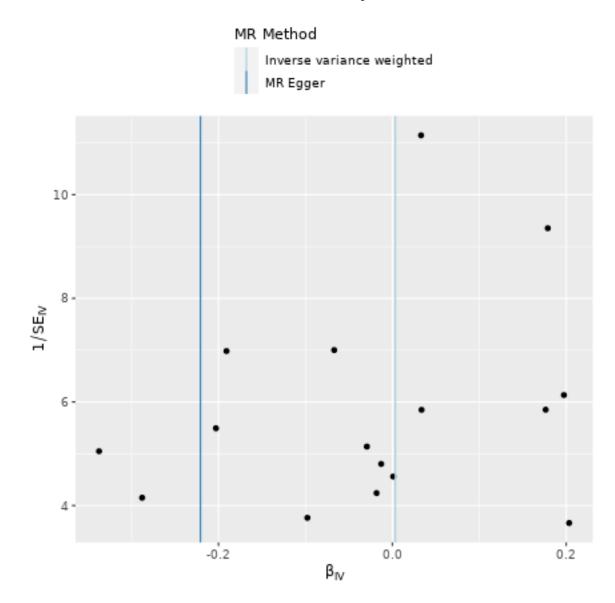




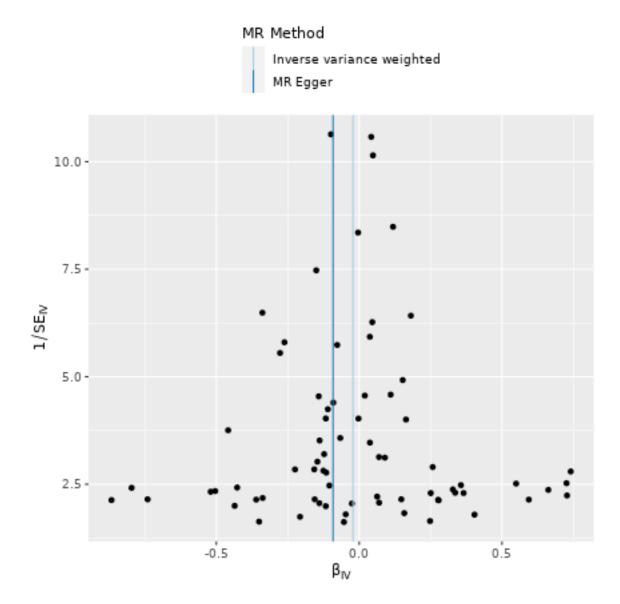
Oral cavity and pharyngeal cancer as exposure



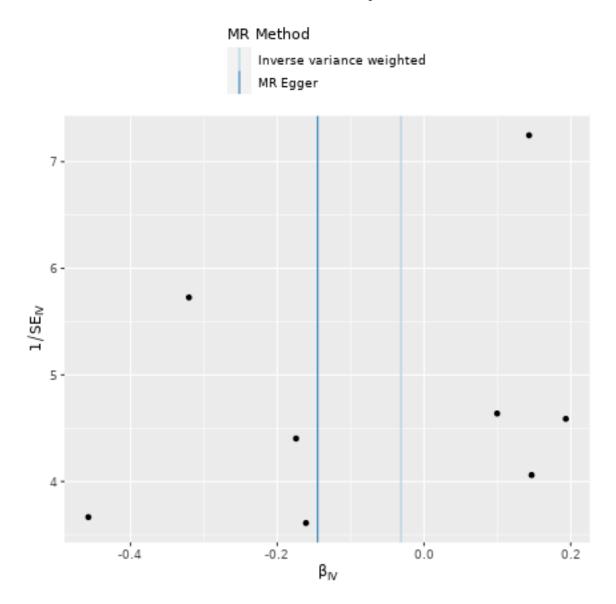
Pancreatic cancer as exposure



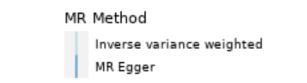
Prostate cancer as exposure

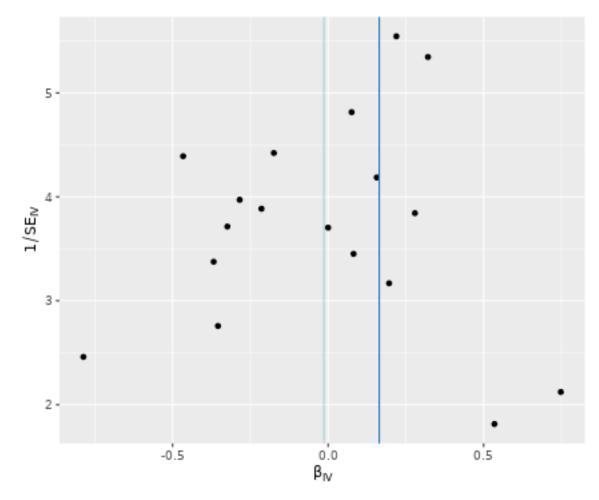


Renal cell carcinoma as exposure



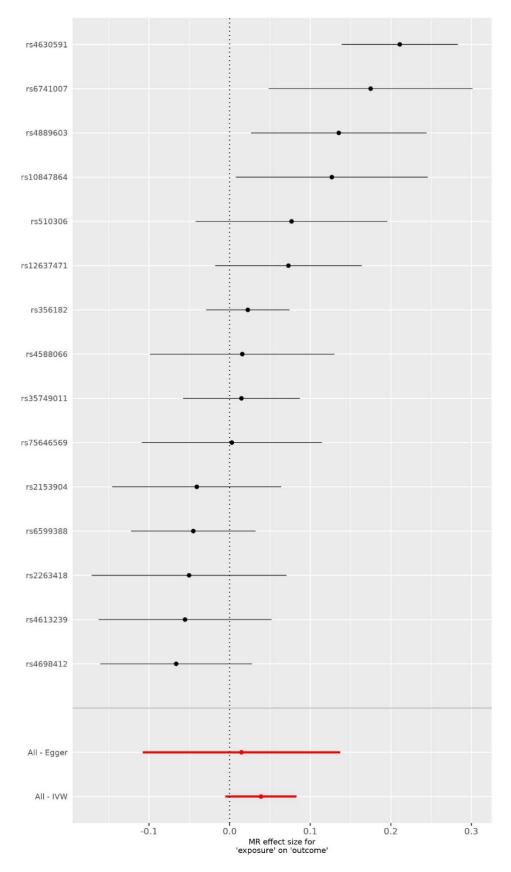
Uterine fibroids as exposure



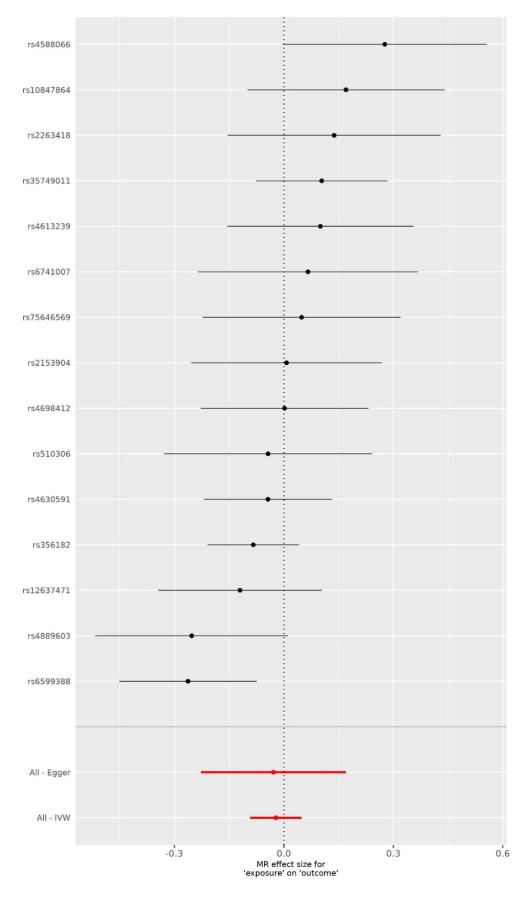


Supplementary Figure 4. Reverse MR (PD as exposure; Cancers as outcome). Forest plots showing point estimates of the exposures of interest, Exposure of interest at the top of each forest plot

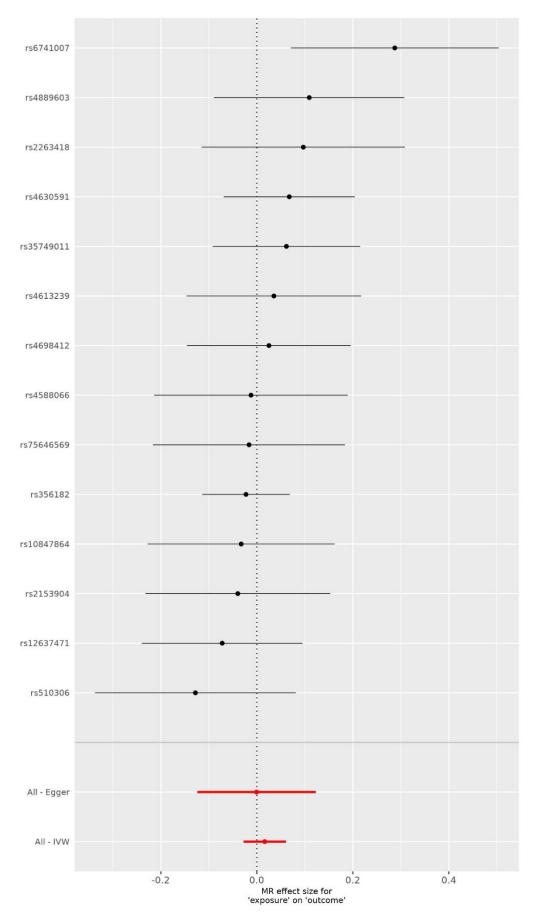
Breast cancer as outcome



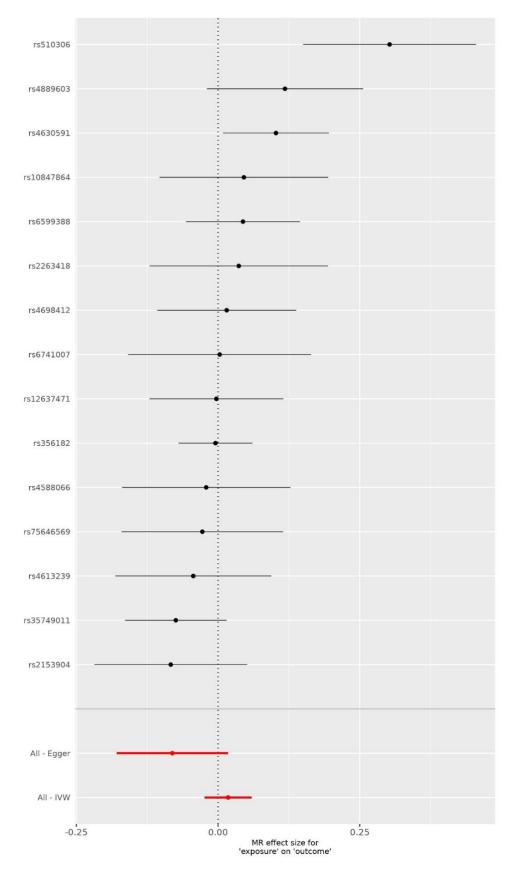
Endometrial cancer as outcome



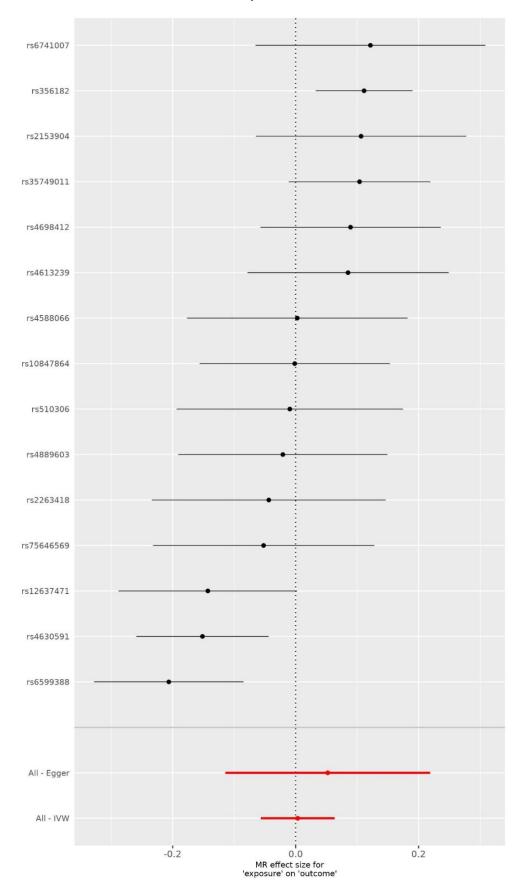
Melanoma as outcome



Prostate as outcome

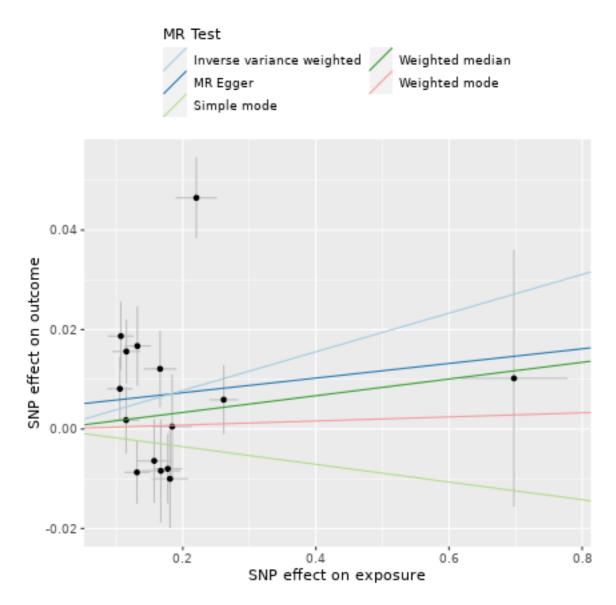


Keratinocytes cancers

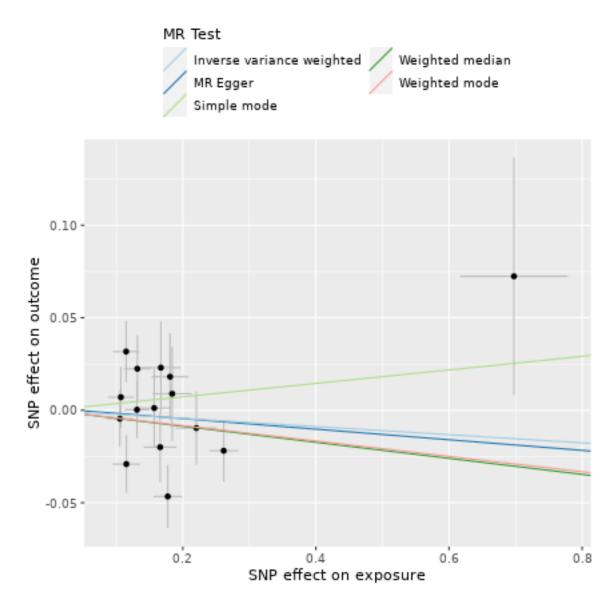


Supplementary Figure 5. Reverse MR (PD as exposure; Cancers as outcome). Plots showing point estimates of the exposures of interest; Exposure of interest at the top of each plot

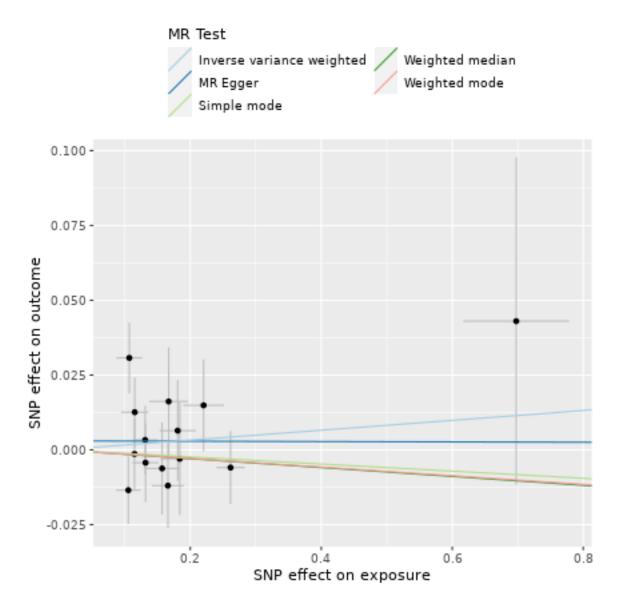
Breast cancer as outcome

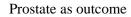


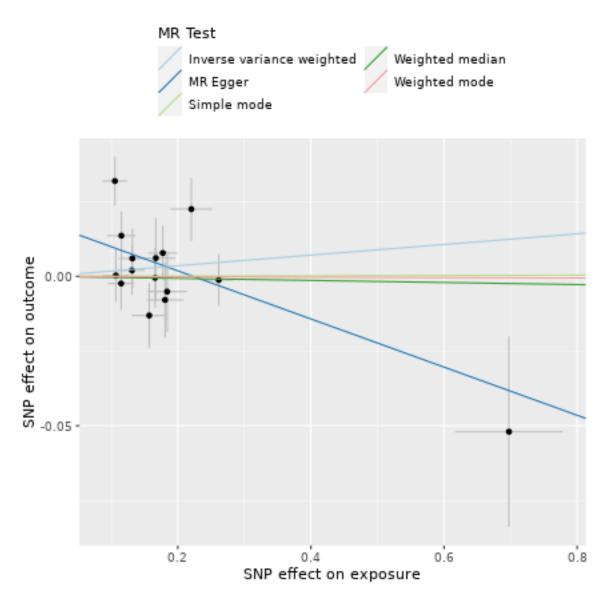
Endometrial cancer as outcome



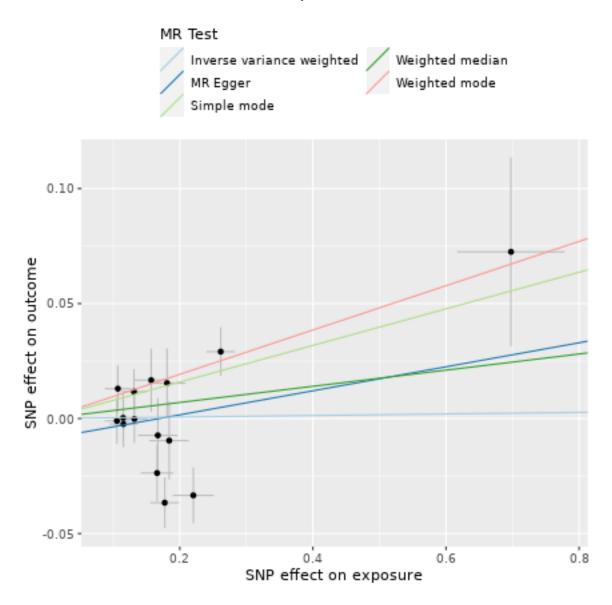
Melanoma as outcome





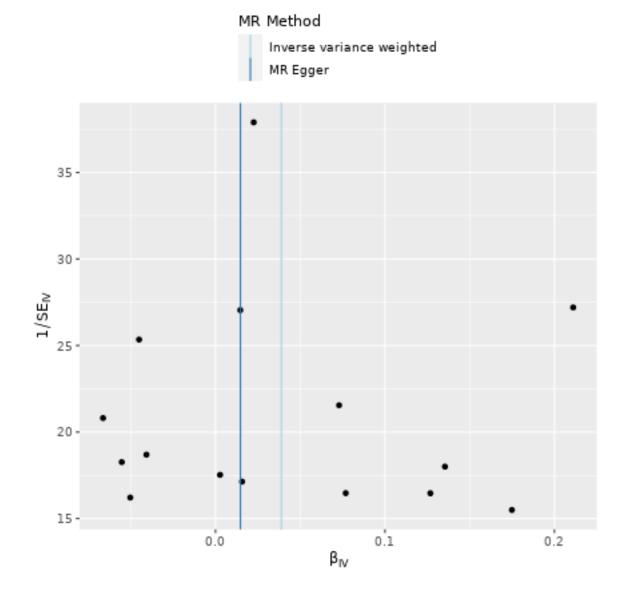


Keratinocytes cancers

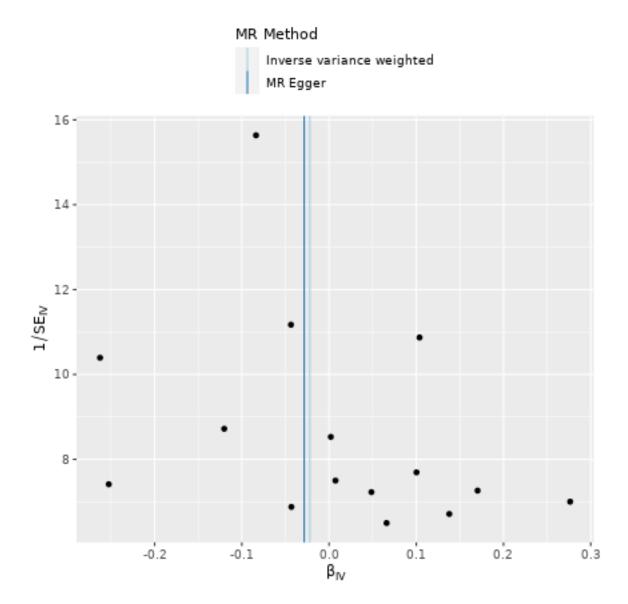


Supplementary Figure 6. Reverse MR (PD as exposure; Cancers as outcome). Funnel plots evaluated the presence of possible heterogeneity across the estimates. Exposure of interest at the top of each plot

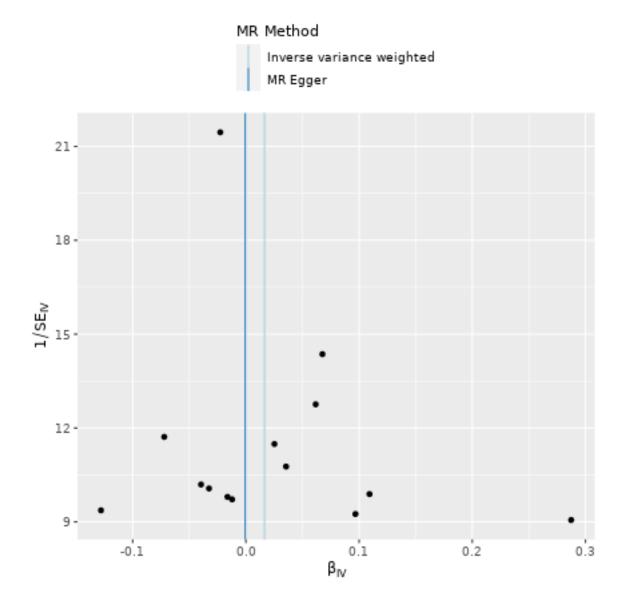
Breast cancer as outcome



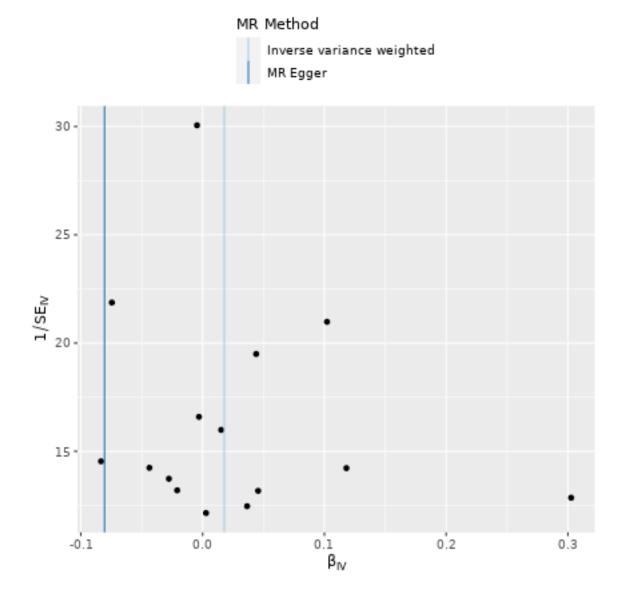
Endometrial cancer as outcome



Melanoma as outcome



Prostate cancer as outcome



Keratinocytes cancers

