

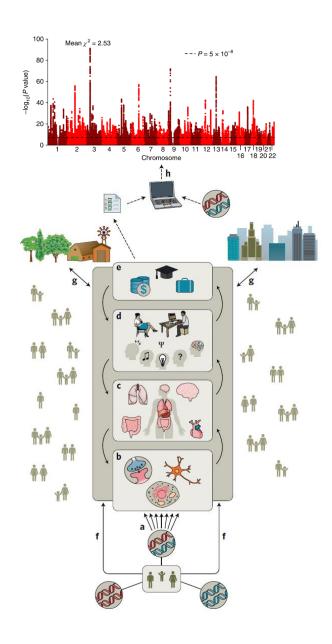
Gene-environment correlations across families and geographic regions affect GWASs

Abdel Abdellaoui



## Key points

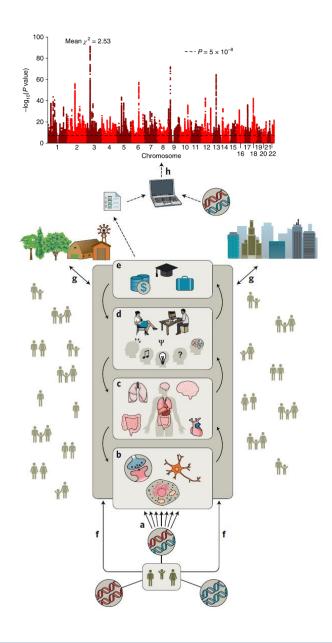
Society makes genetic effects stronger.



## Key points

Society makes genetic effects stronger.

We reward certain genetic propensities with a better environment, and "punish" the lack of those propensities with a worse environment.



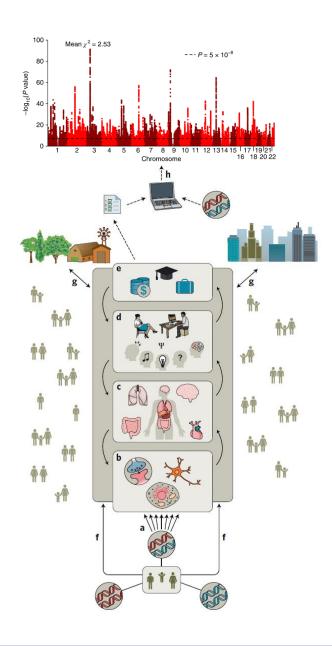
## Key points

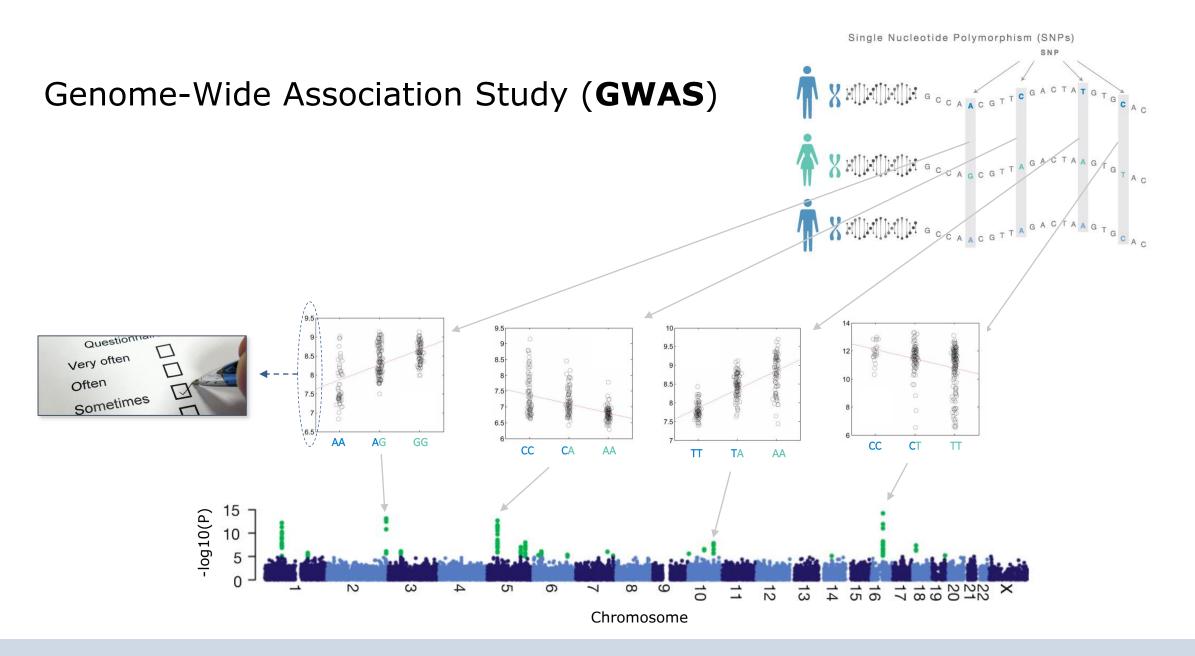
Society makes genetic effects stronger.

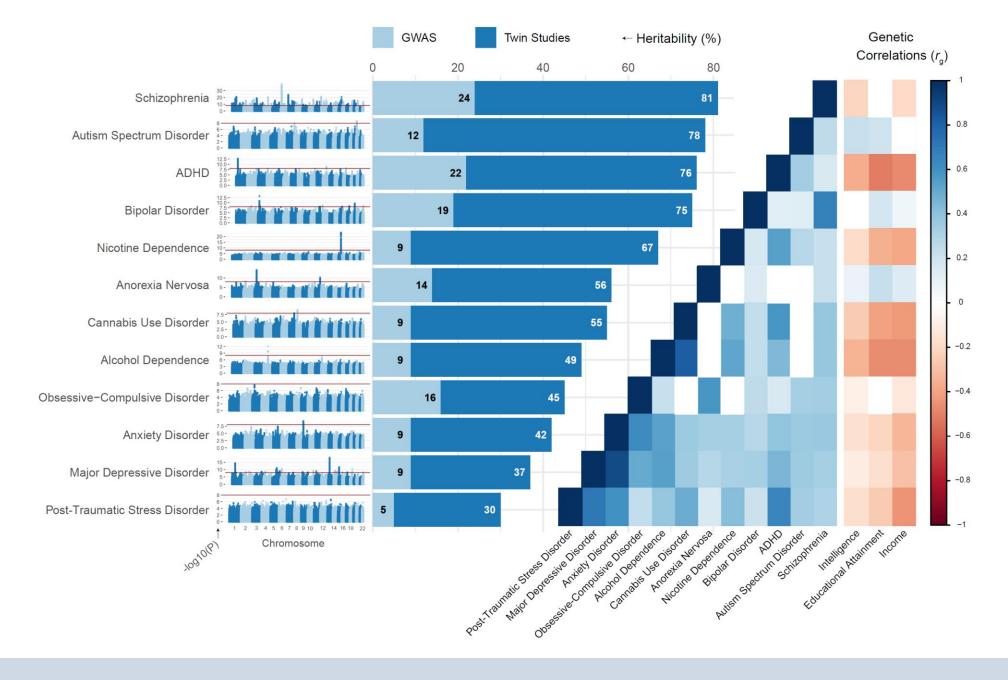
We reward certain genetic propensities with a better environment, and "punish" the lack of those propensities with a worse environment.

This makes society more unequal.

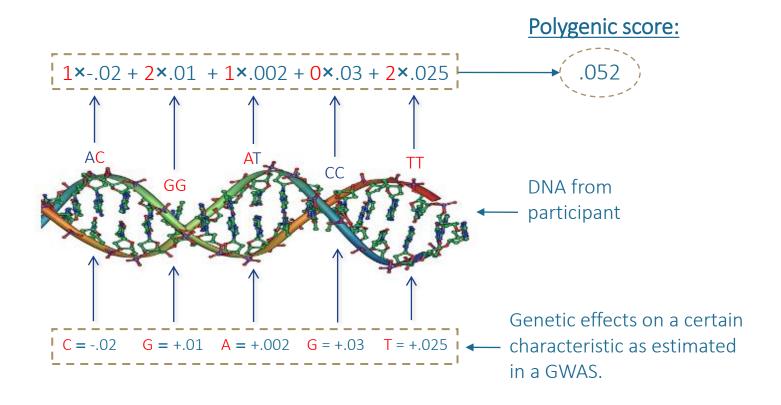
This makes studying genetics more difficult.

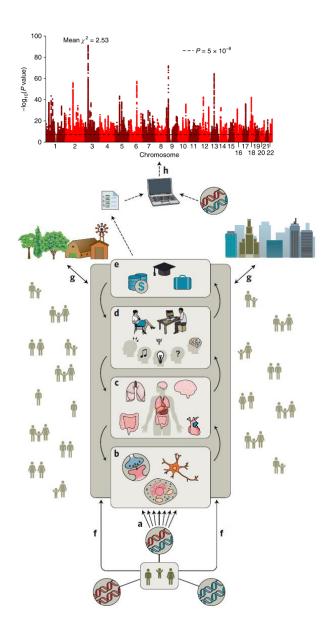


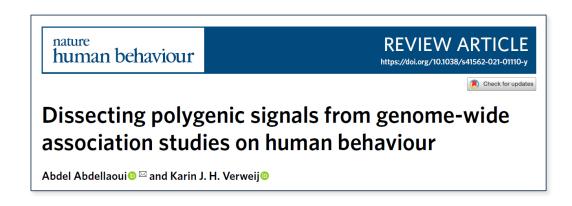


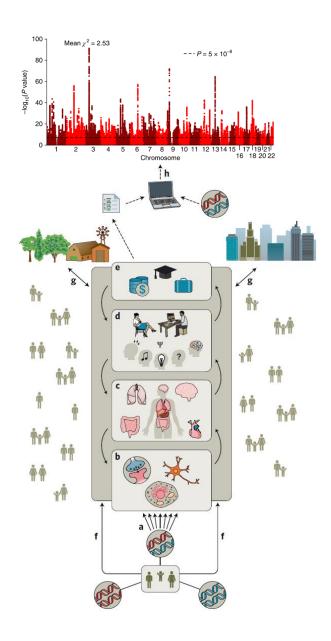


## <u>Polygenic Score</u> = measure of genetic predisposition for complex trait or disease

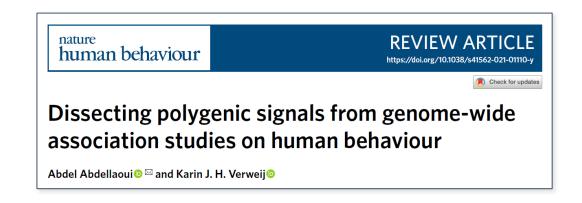


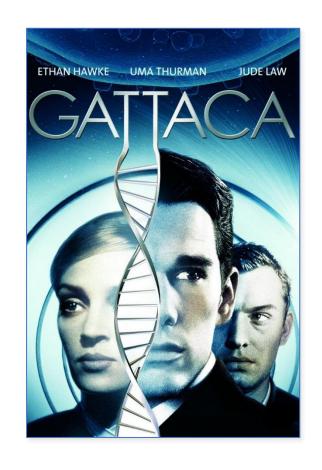


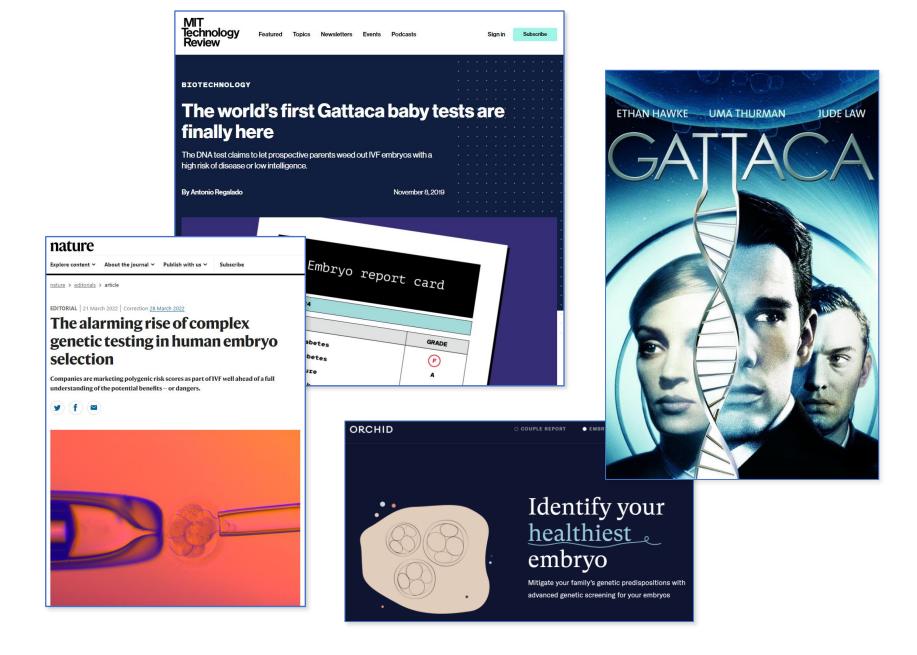




"When the nature of the predictive ability of polygenic scores for behavioural traits is not fully understood, applying them in either scientific research or the clinic can lead to incorrect interpretations and conclusions."



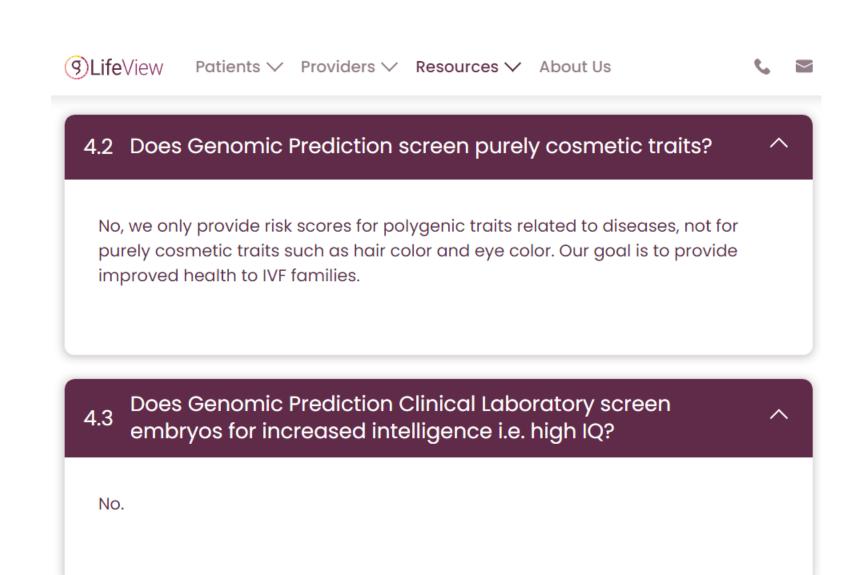


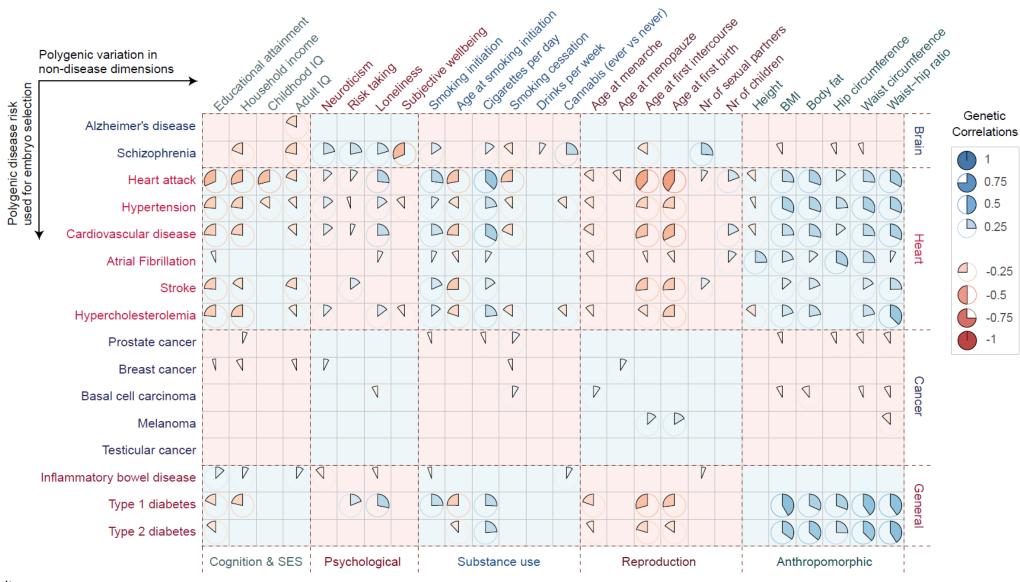


### WIRED Genetic Screening Now Lets Parents Pick the Healthiest Embryos

AT 18 MONTHS old, Aurea Yenmai Smigrodzki is inquisitive like any other toddler. She likes peanut butter, the beach, and mobile phones—or any toys that look like phones. She likes to copy her mum and dad, Thuy and Rafal, when they are using theirs. Aurea doesn't know it yet, but her birth was very special: She is the world's first PGT-P baby, meaning she is statistically less likely than the rest of us to develop a genetic disease or disorder throughout her life.







Unpublished results

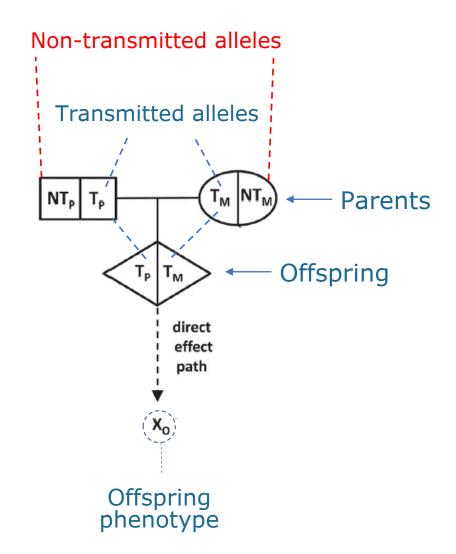
Gene-Environment Correlations - Families

Science 359, 424-428 (2018)

#### **HUMAN GENOMICS**

## The nature of nurture: Effects of parental genotypes

Augustine Kong, <sup>1,2,3</sup>\* Gudmar Thorleifsson, <sup>1</sup> Michael L. Frigge, <sup>1</sup>
Bjarni J. Vilhjalmsson, <sup>4,5</sup> Alexander I. Young, <sup>1,2,6</sup> Thorgeir E. Thorgeirsson, <sup>1</sup>
Stefania Benonisdottir, <sup>1</sup> Asmundur Oddsson, <sup>1</sup> Bjarni V. Halldorsson, <sup>1</sup> Gisli Masson, <sup>1</sup>
Daniel F. Gudbjartsson, <sup>1,3</sup> Agnar Helgason, <sup>1,7</sup> Gyda Bjornsdottir, <sup>1</sup>
Unnur Thorsteinsdottir, <sup>1,8</sup> Kari Stefansson <sup>1,8</sup>\*

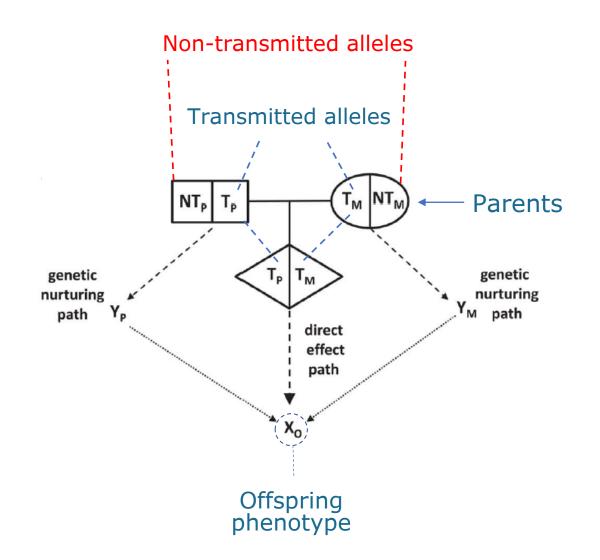


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Science 359, 424-428 (2018)

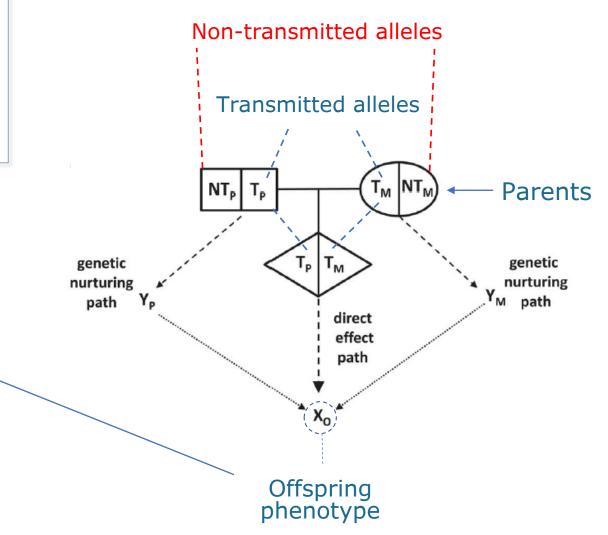
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Non-transmitted educational attainment alleles are associated with:

- Educational attainment
- Age at first child
- High-density lipoprotein (HDL)
- BMI
- Fasting glucose level
- Height
- Cigarettes per day
- Overall health



Research Article

# ASSOCIATION FOR PSYCHOLOGICAL SCIENCE

### Comparison of Adopted and Nonadopted Individuals Reveals Gene–Environment Interplay for Education in the UK Biobank

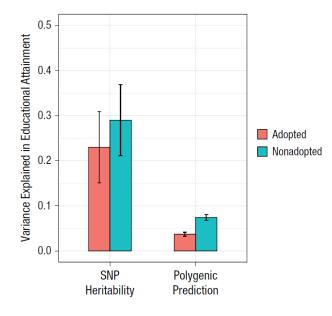
Psychological Science 2020, Vol. 31(5) 582–591 © The Author(s) 2020



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\$SAGE

Rosa Cheesman<sup>1</sup>, Avina Hunjan<sup>1,2</sup>, Jonathan R. I. Coleman<sup>1,2</sup>, Yasmin Ahmadzadeh<sup>1</sup>, Robert Plomin<sup>1</sup>, Tom A. McAdams<sup>1</sup>, Thalia C. Eley<sup>1,2</sup>, and Gerome Breen<sup>1,2</sup>

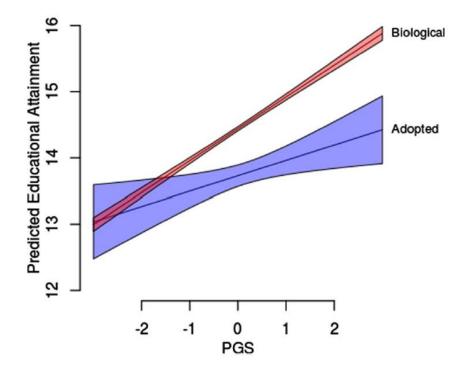


Behavior Genetics
https://doi.org/10.1007/s10519-020-10000-4

ORIGINAL RESEARCH

Separating Measured Genetic and Environmental Effects: Evidence
Linking Parental Genotype and Adopted Child Outcomes

Benjamin W. Domingue<sup>1</sup> • Jason Fletcher<sup>2</sup>

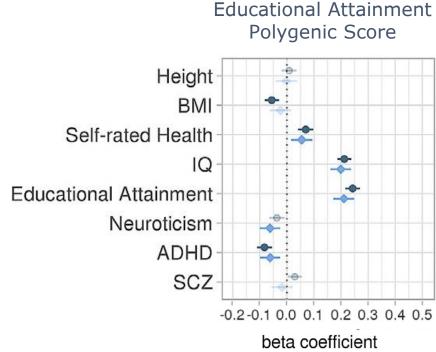


The American Journal of Human Genetics 105, 351-363, August 1, 2019

**ARTICLE** 

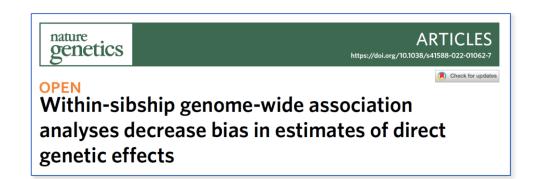
## Comparing Within- and Between-Family Polygenic Score Prediction

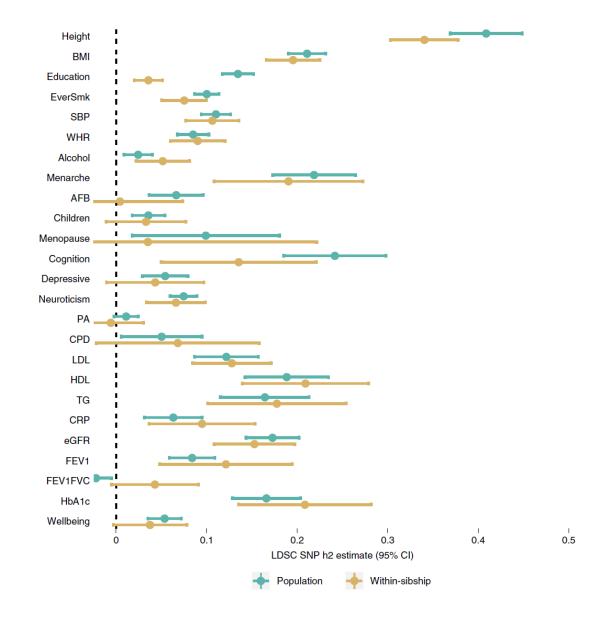
Saskia Selzam,<sup>1,\*</sup> Stuart J. Ritchie,<sup>1</sup> Jean-Baptiste Pingault,<sup>1,2</sup> Chandra A. Reynolds,<sup>3</sup> Paul F. O'Reilly,<sup>1,4</sup> and Robert Plomin<sup>1</sup>

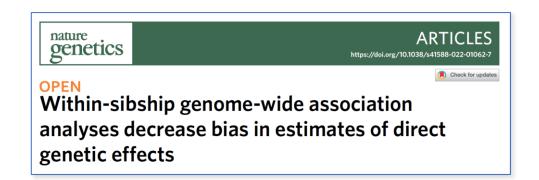


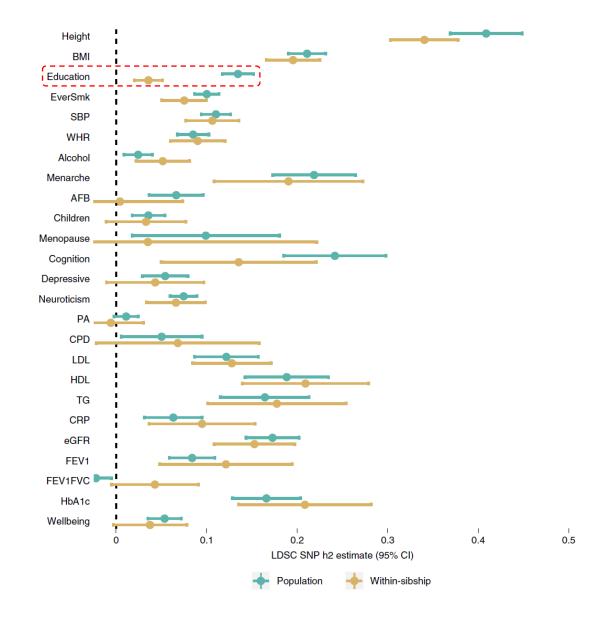
between-familywithin-family

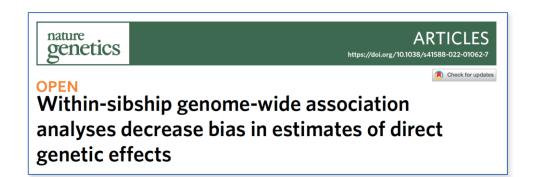
**Estimate** 

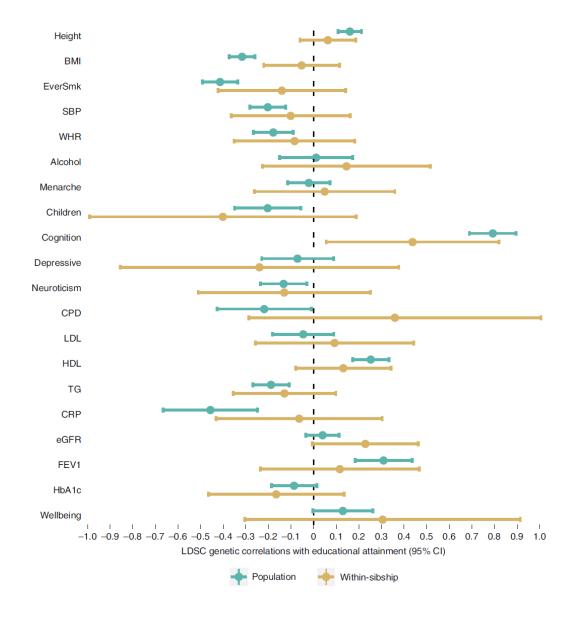






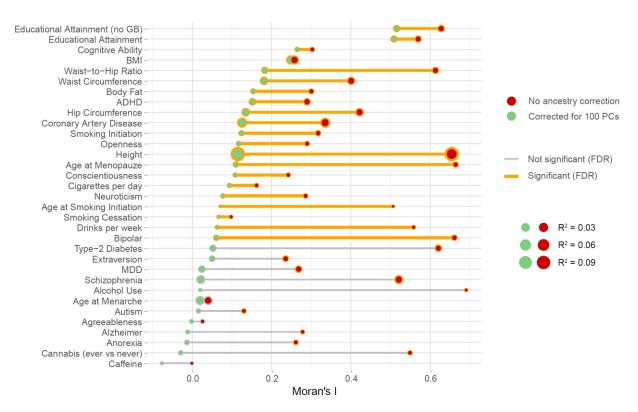






Gene-Environment Correlations - Geographic

# Geography & Polygenic Scores



Moran's I = measure for geographic clustering



## Genetic correlates of social stratification in Great Britain

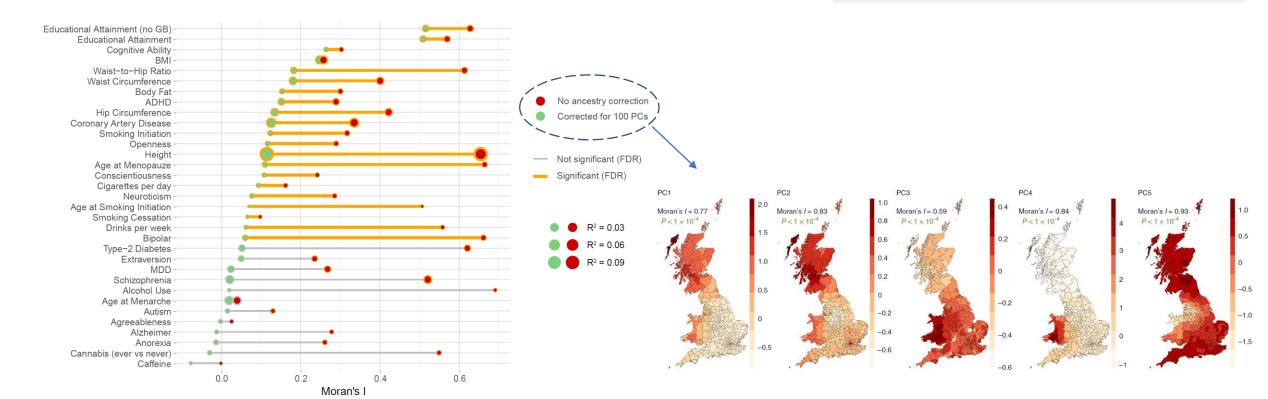
Abdel Abdellaoui 14, David Hugh-Jones<sup>2</sup>, Loic Yengo 3, Kathryn E. Kemper 3, Michel G. Nivard 4, Laura Veul<sup>1</sup>, Yan Holtz<sup>3</sup>, Brendan P. Zietsch 5, Timothy M. Frayling<sup>6</sup>, Naomi R. Wray 3, Jian Yang 3, Karin J. H. Verweij and Peter M. Visscher 3, Karin J. H. Verweij and Peter M. Visscher 5, Karin J. H. Verweij and Peter M. Visscher 5, Karin J. H. Verweij and Peter M. Visscher 5, Karin J. H. Verweij and Peter M. Visscher 5, Karin J. H. Verweij and Peter M. Visscher 5, Karin J. H. Verweij and Peter M. Visscher 5, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and Peter M. Visscher 6, Karin J. H. Verweij and M. Visscher 6, Karin J. H.

# Geography & Polygenic Scores



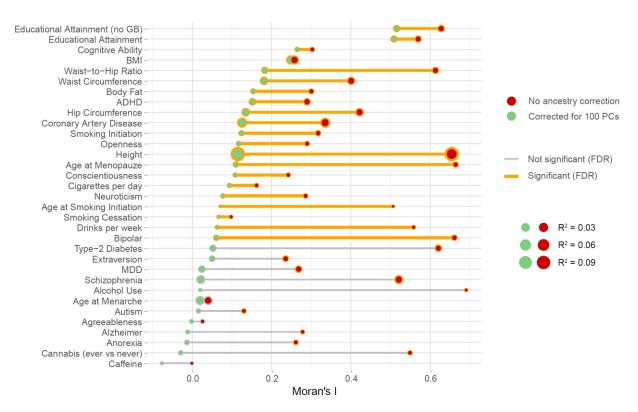
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Moran's I = measure for geographic clustering

# Geography & Polygenic Scores

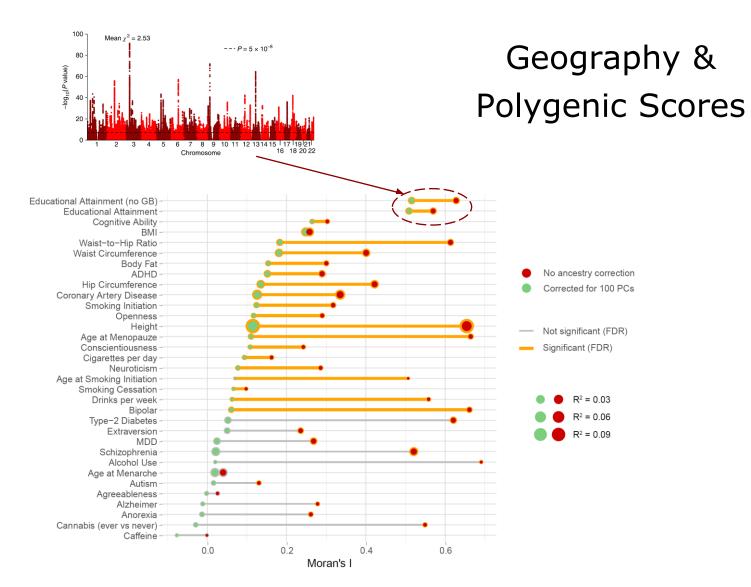


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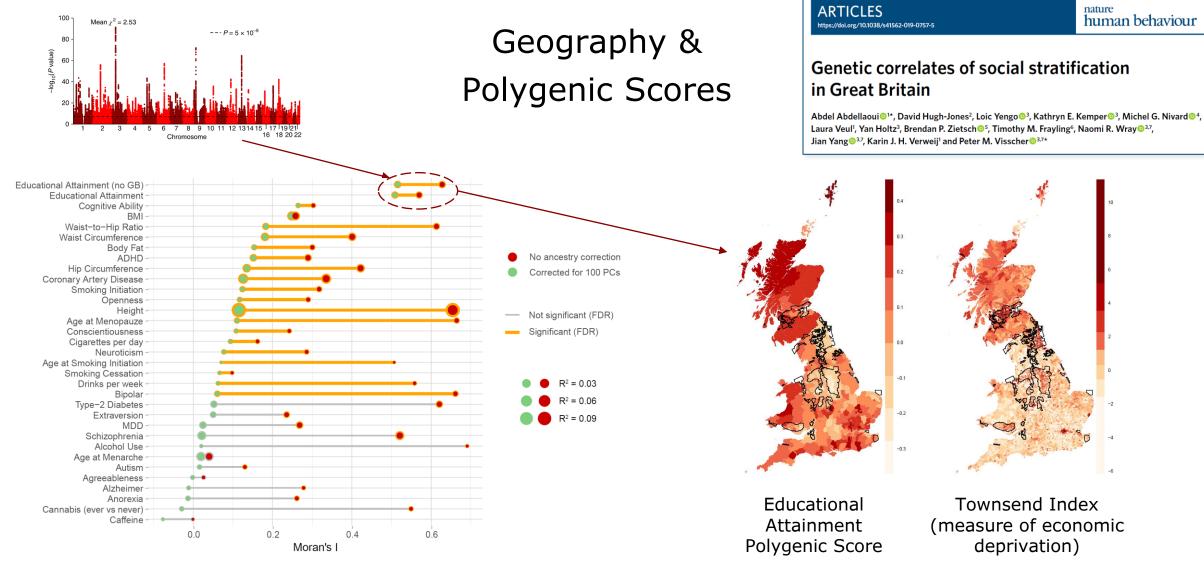


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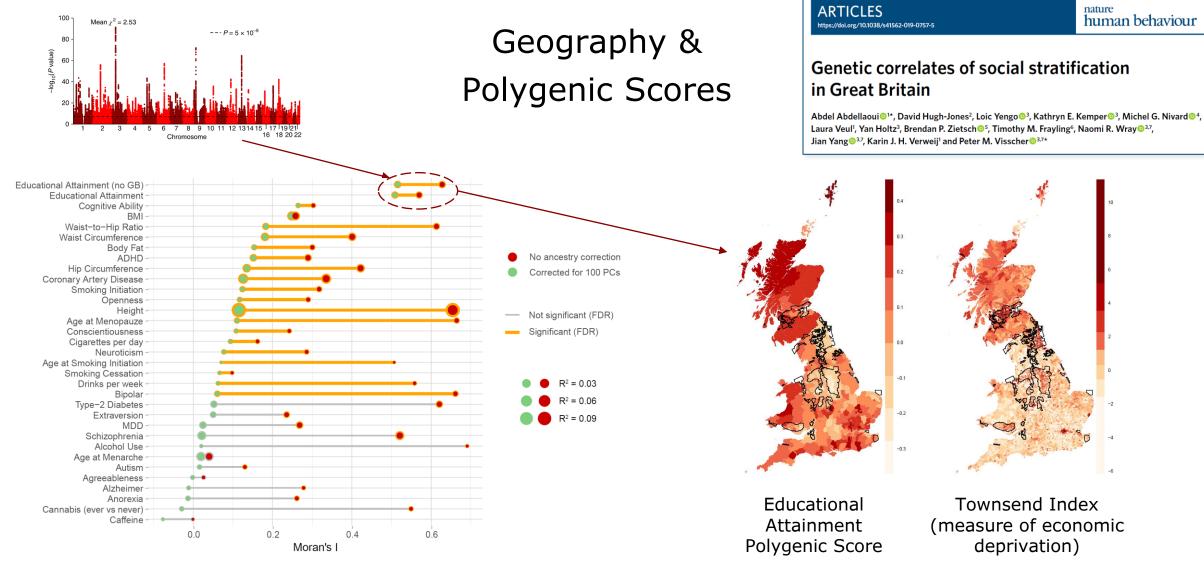
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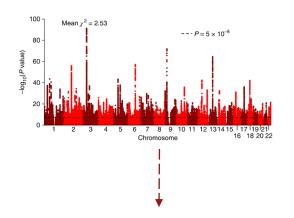
Moran's I = measure for geographic clustering

black lines = coal regions



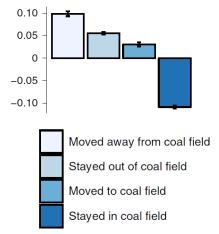
Moran's I = measure for geographic clustering

black lines = coal regions



## Migration & SES

### Educational Attainment Polygenic Score

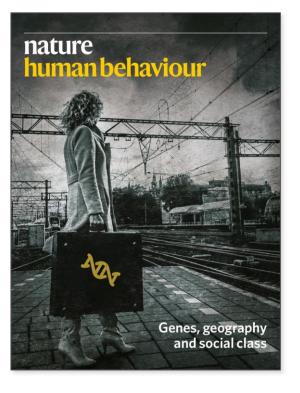


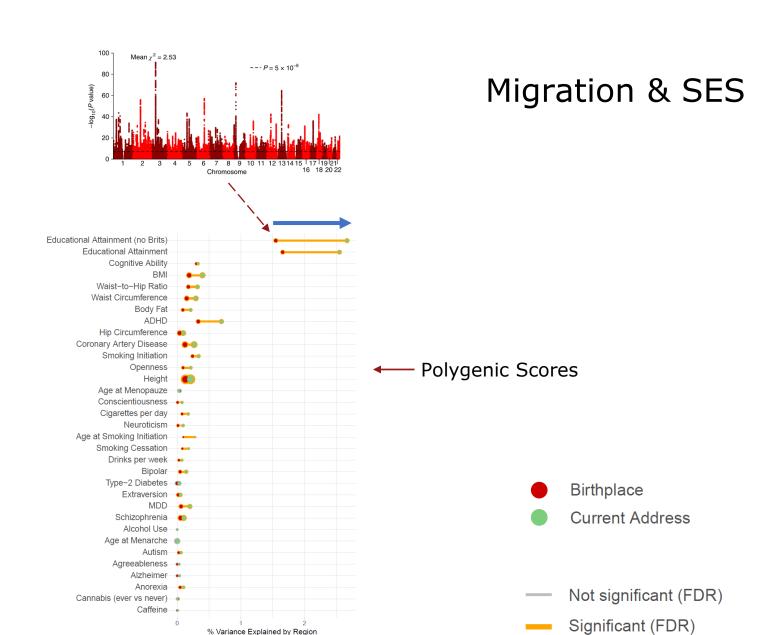


human behaviour

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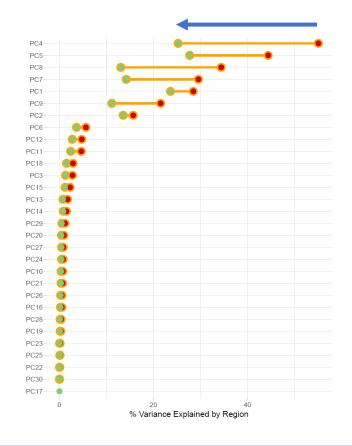


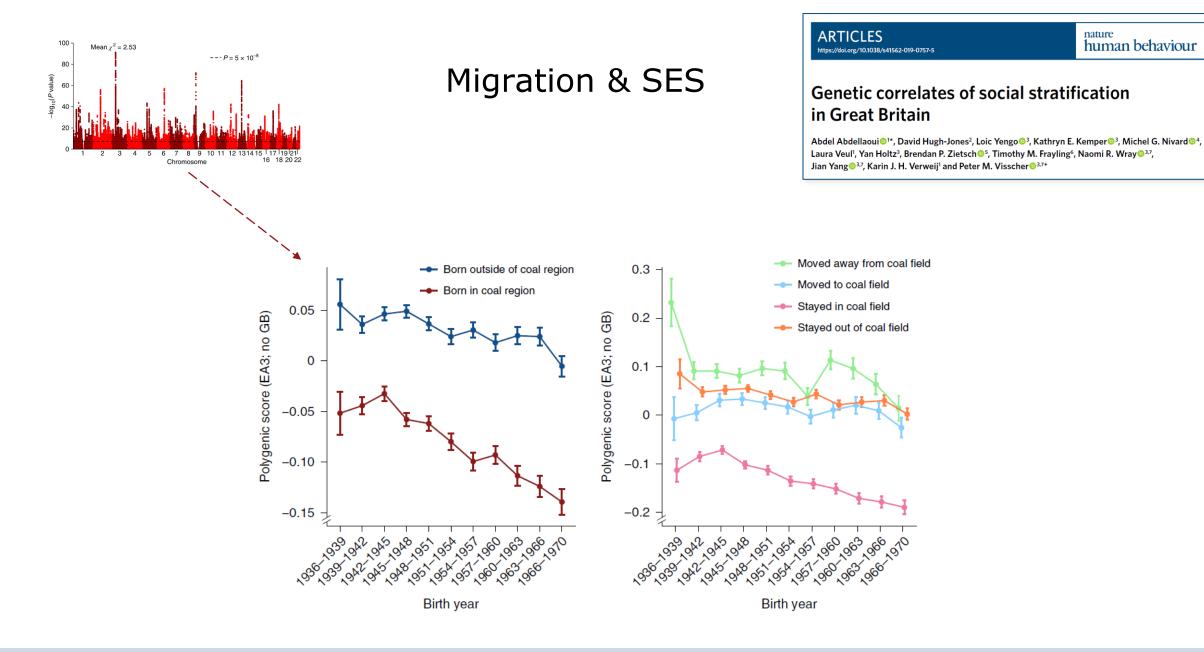




## Genetic correlates of social stratification in Great Britain

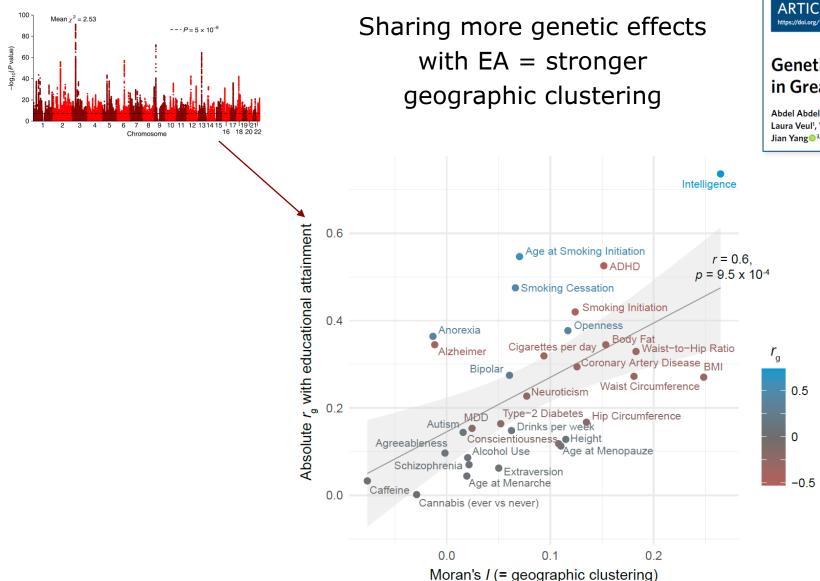
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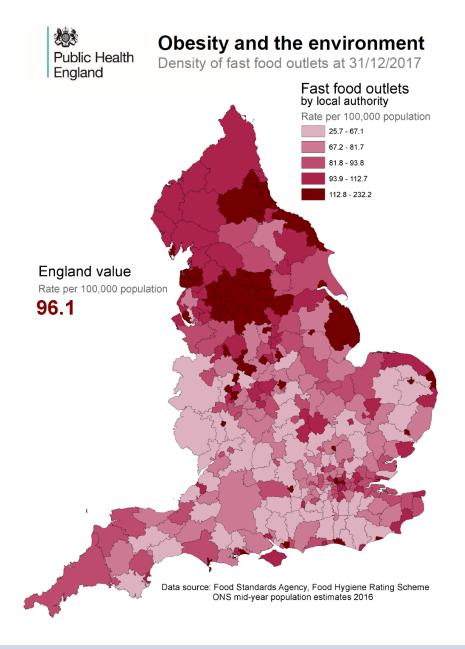
nature

human behaviour



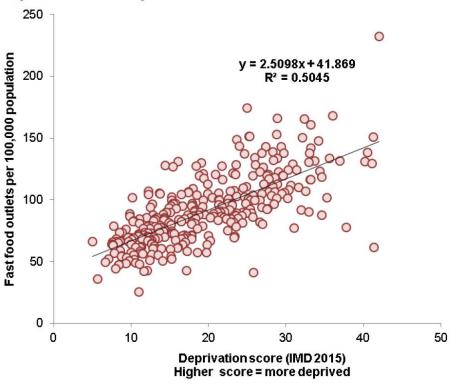
## Genetic correlates of social stratification in Great Britain

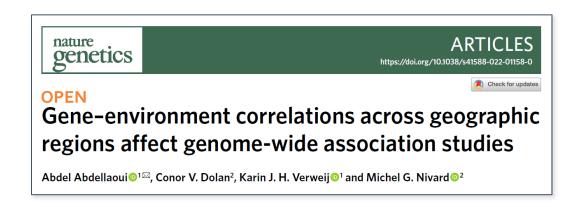
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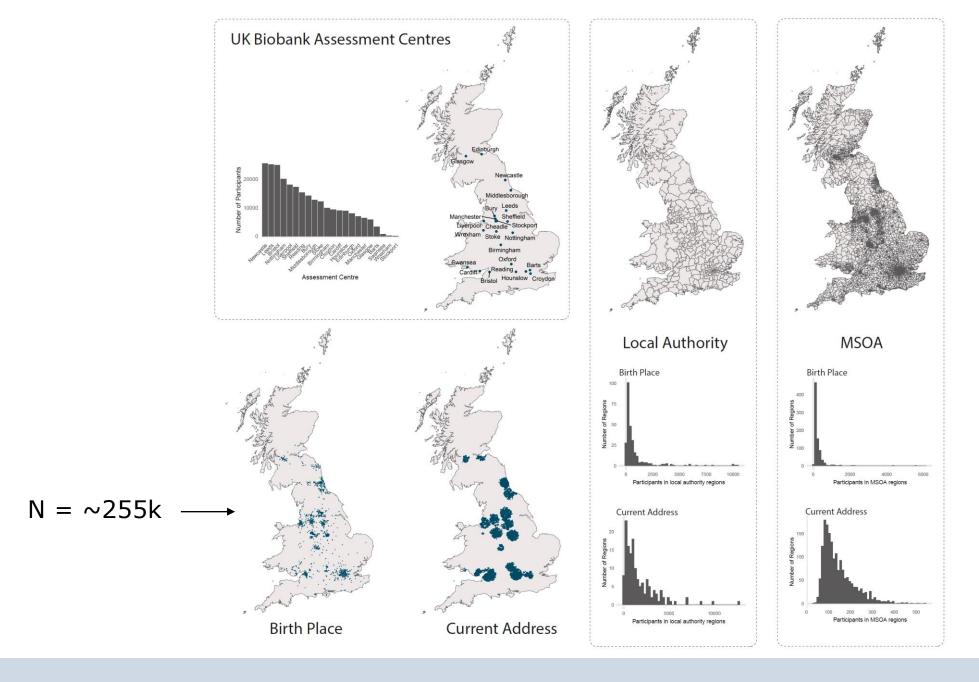
## Relationship between density of fast food outlets and deprivation by local authority\*

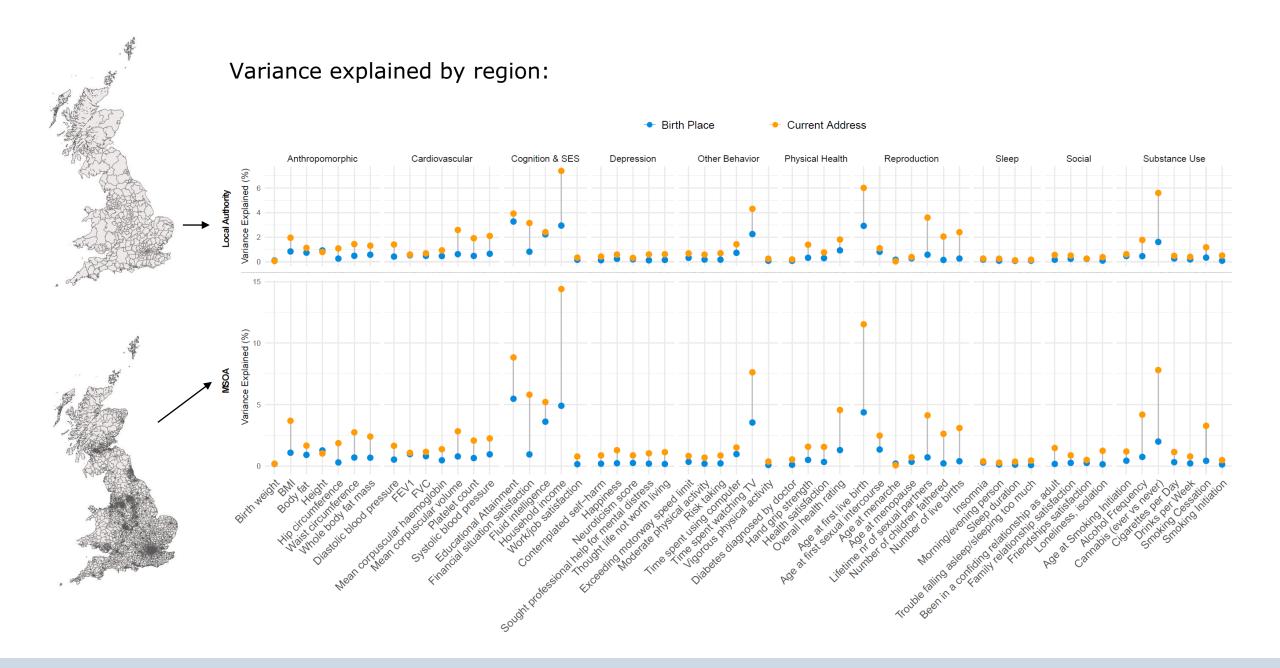




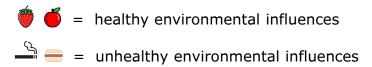
The paper consists of two parts:

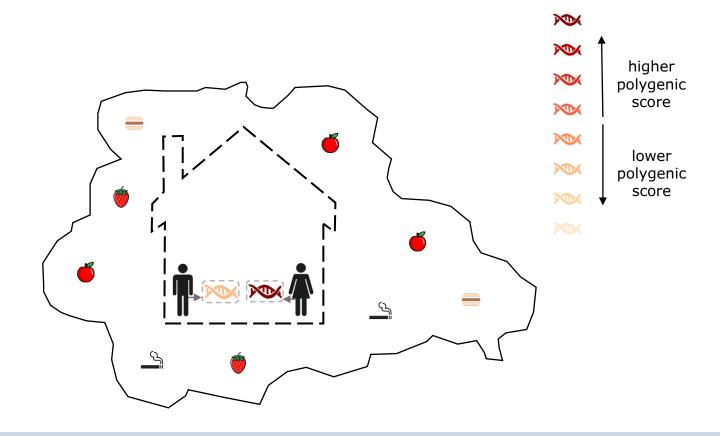
- **Part 1**: detecting gene-environment correlations using polygenic scores in up to 43,516 siblings
- **Part 2**: controlling for gene-environment correlations in GWASs in up to 254,387 participants



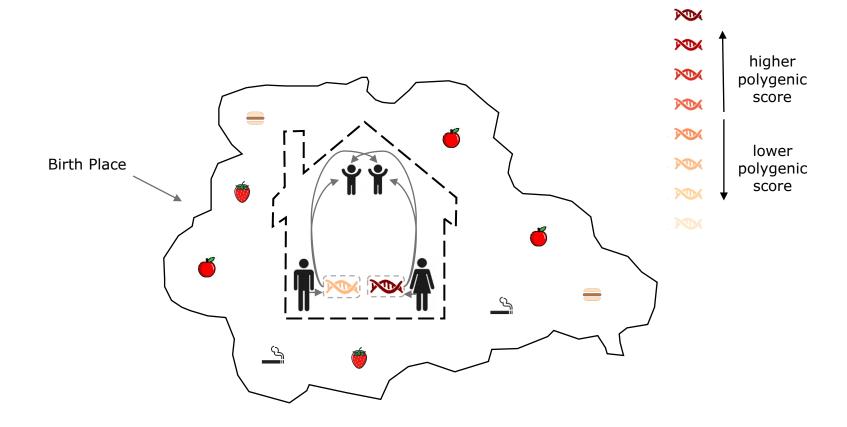


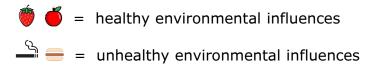
Polygenic Scores in Siblings

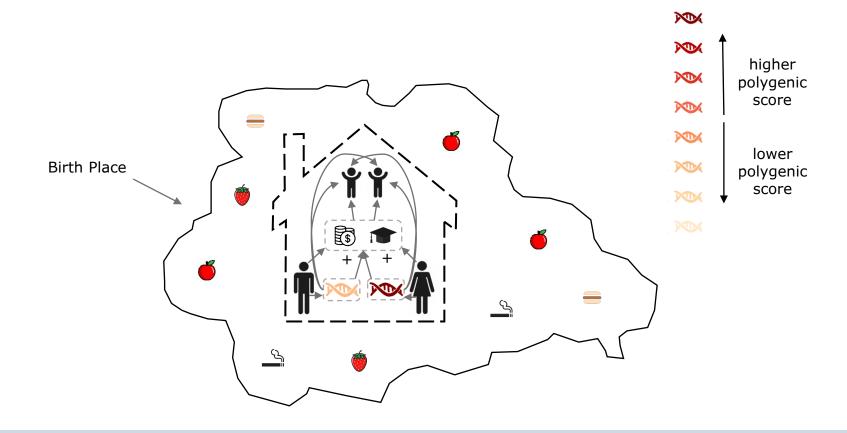




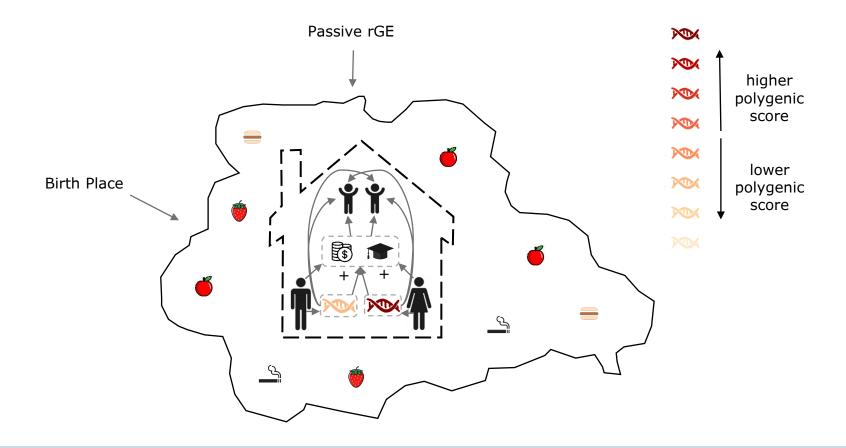
= healthy environmental influences= unhealthy environmental influences

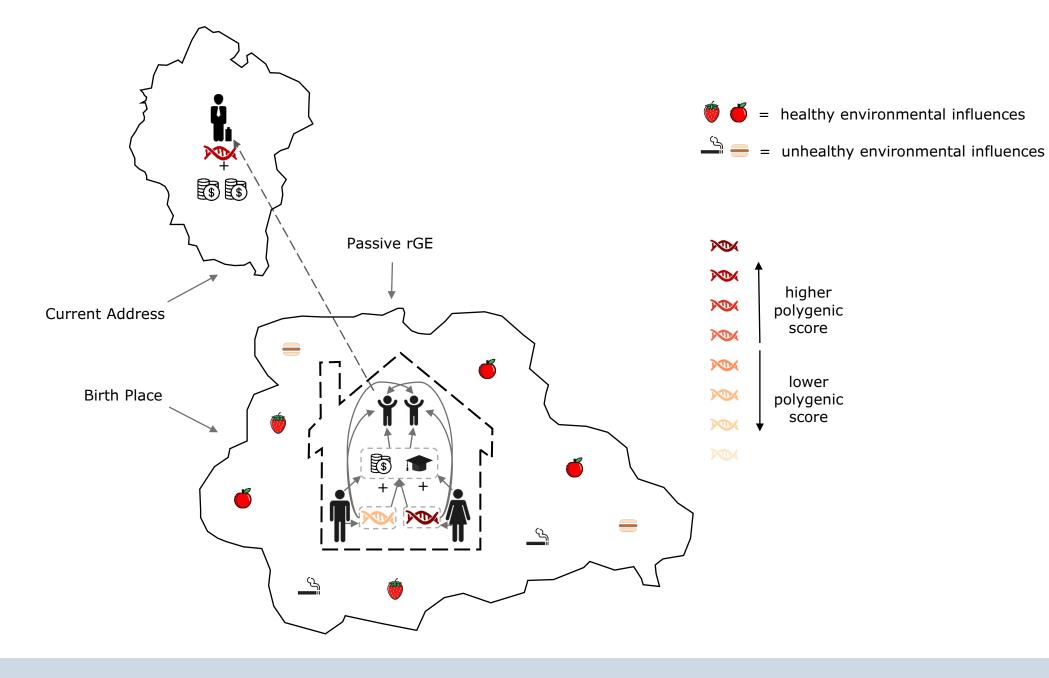


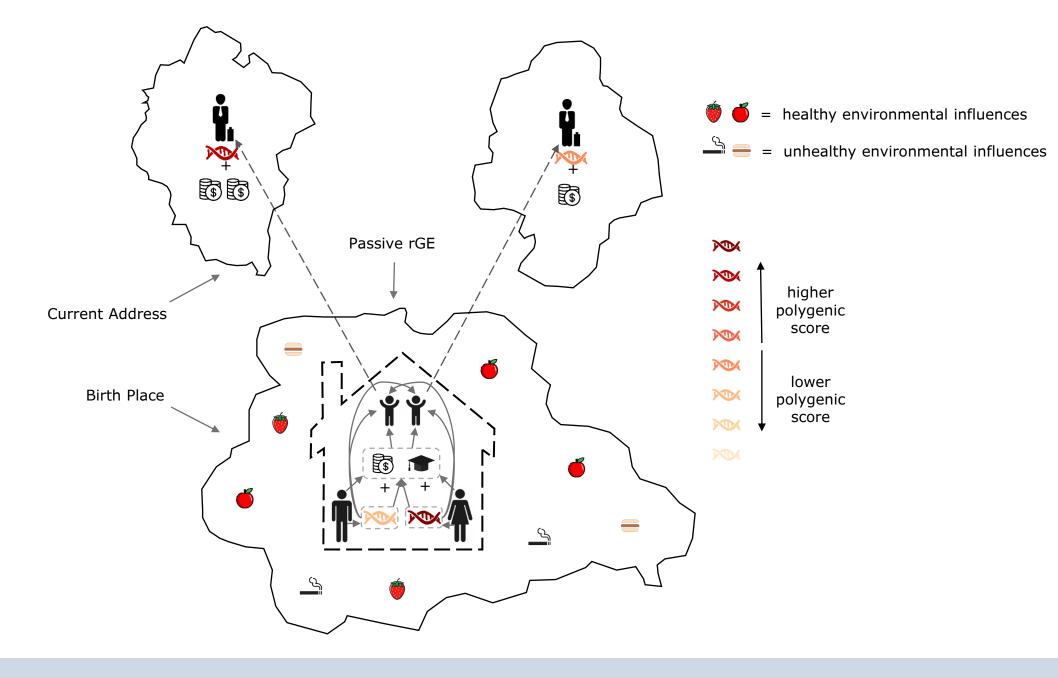


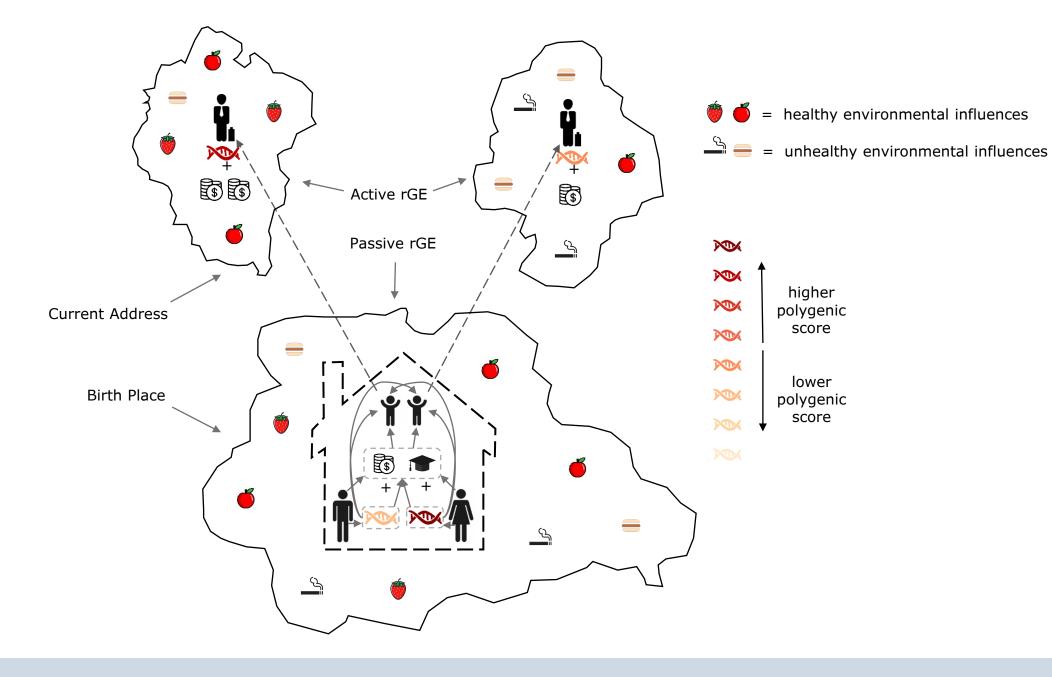


= healthy environmental influences= unhealthy environmental influences









ARTICLE

# Comparing Within- and Between-Family Polygenic Score Prediction

Saskia Selzam,<sup>1,\*</sup> Stuart J. Ritchie,<sup>1</sup> Jean-Baptiste Pingault,<sup>1,2</sup> Chandra A. Reynolds,<sup>3</sup> Paul F. O'Reilly,<sup>1,4</sup> and Robert Plomin<sup>1</sup>

$$Y_{ij} = \alpha_0 + \beta PRS_{ij} + \gamma_j + \varepsilon_{ij},$$

### **ARTICLE**

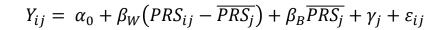
# Comparing Within- and Between-Family Polygenic Score Prediction

Saskia Selzam,<sup>1,\*</sup> Stuart J. Ritchie,<sup>1</sup> Jean-Baptiste Pingault,<sup>1,2</sup> Chandra A. Reynolds,<sup>3</sup> Paul F. O'Reilly,<sup>1,4</sup> and Robert Plomin<sup>1</sup>

### **ARTICLE**

 $Y_{ij} = \alpha_0 + \beta PRS_{ij} + \gamma_j + \varepsilon_{ij},$ 

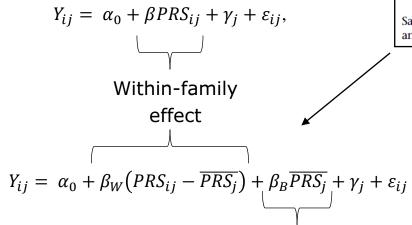
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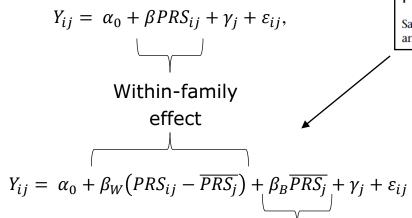


Betweenfamily effect

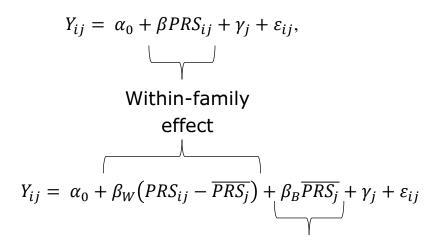
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# Comparing Within- and Between-Family Polygenic Score Prediction

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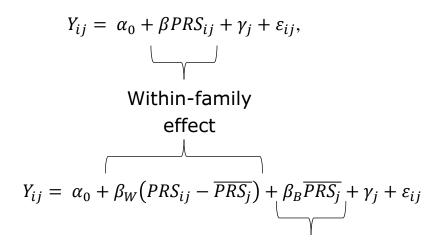
Betweenfamily effect In children (N ~2,300 pairs), predictive power of polygenic scores of cognitive traits (intelligence & education) was 60% greater between families than within families.



Betweenfamily effect

We looked at adult siblings (N ~26k pairs) in UK Biobank.

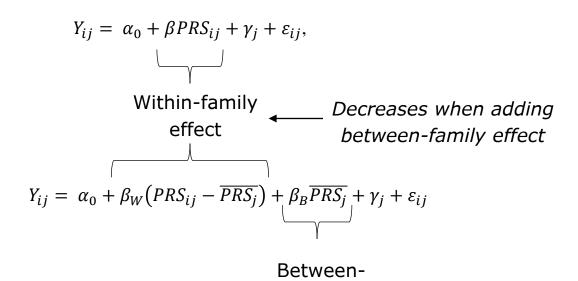
PRS = Educational
Attainment Polygenic Score
(based on GWAS excluding
all British)



Betweenfamily effect

Are there any additional geneenvironment correlations at the regional level not captured by family? We looked at adult siblings (N ~26k pairs) in UK Biobank.

PRS = Educational
Attainment Polygenic Score
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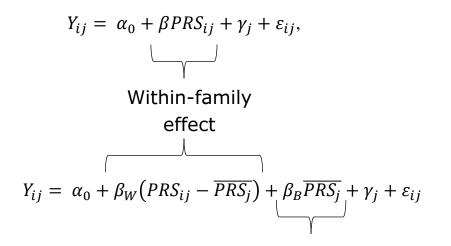


family effect

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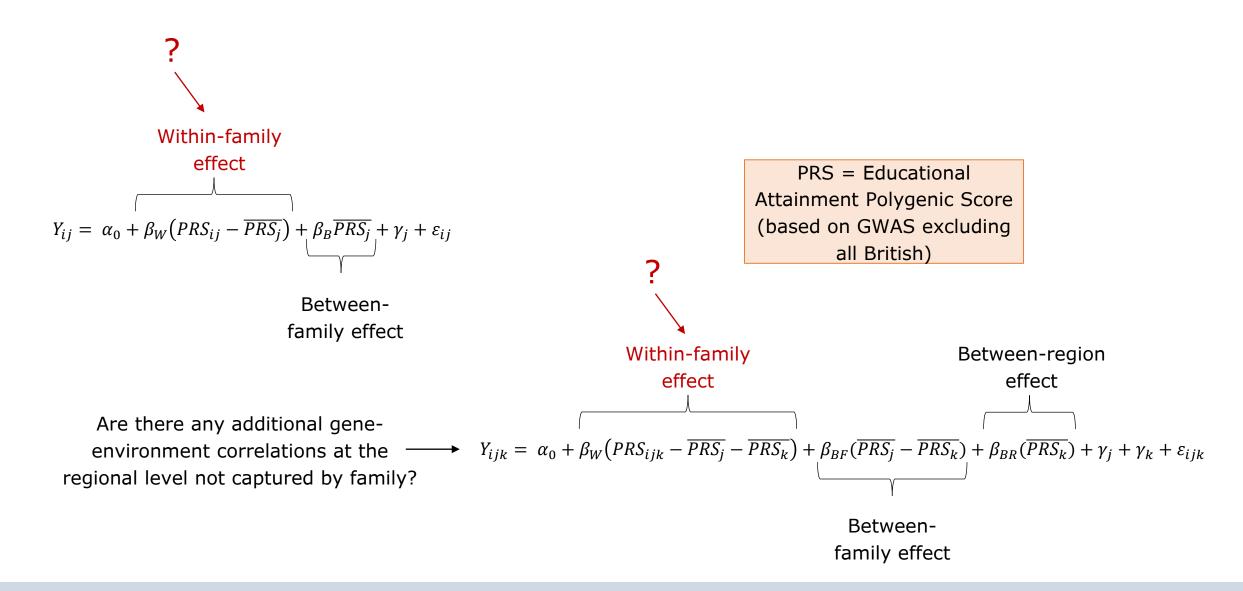
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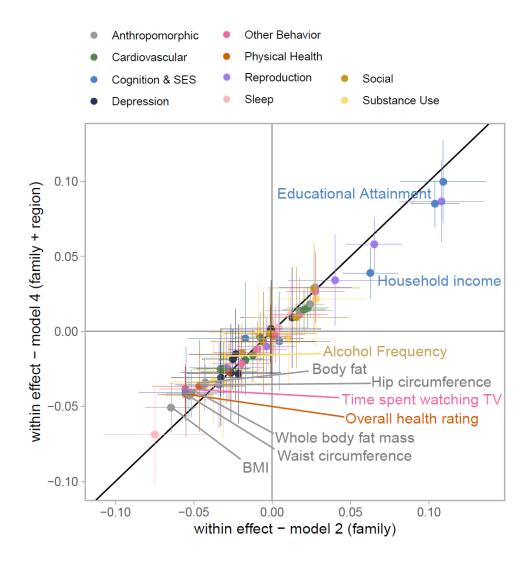
Betweenfamily effect

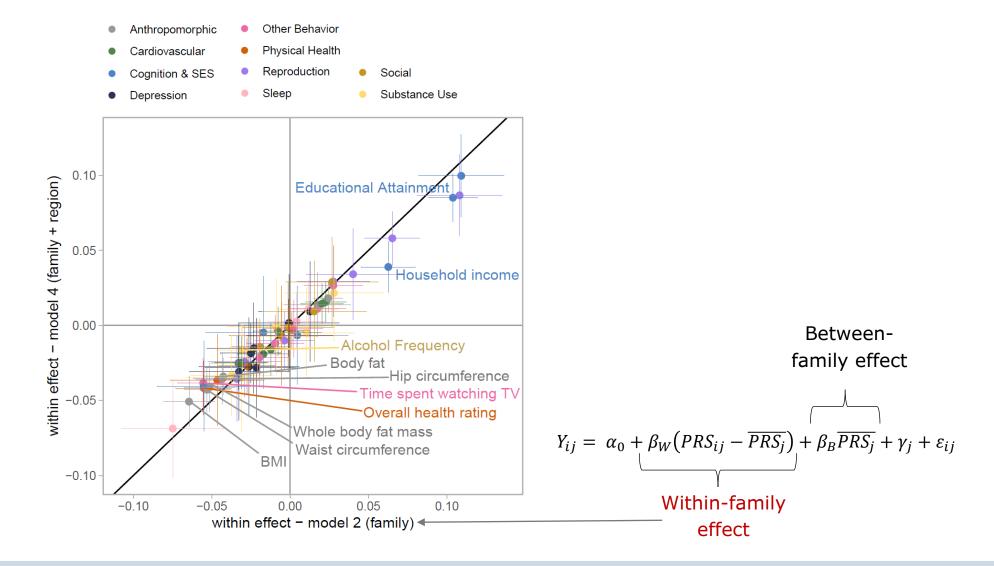
Are there any additional generegional level not captured by family?

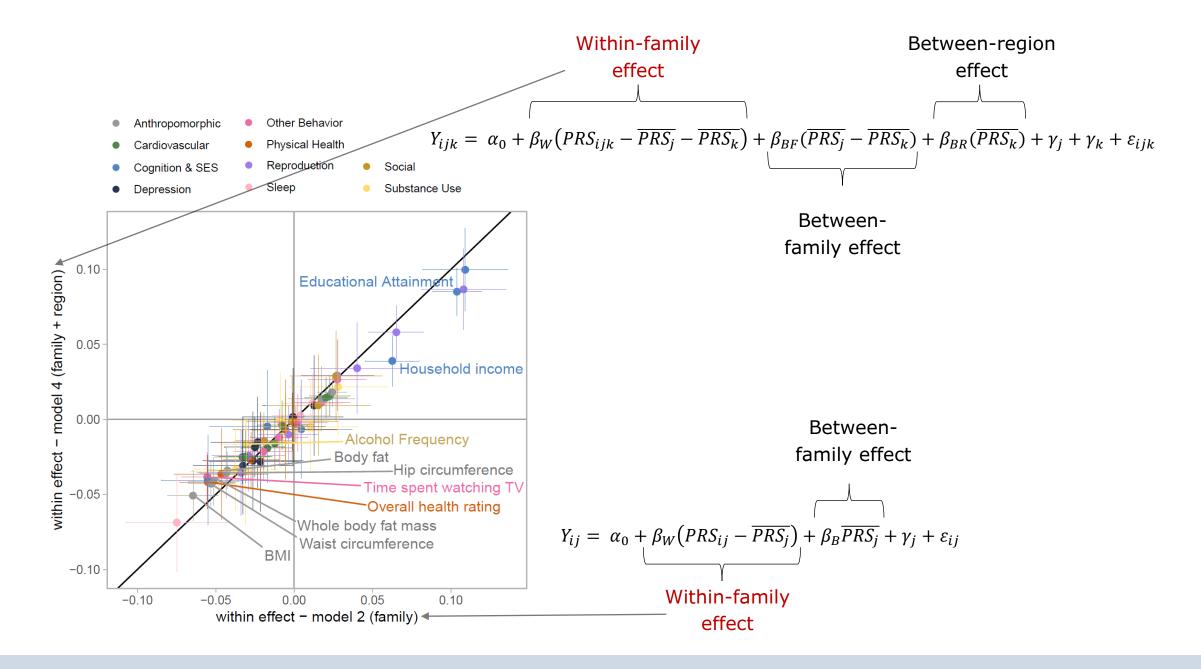
Within-family Between-region effect effect environment correlations at the  $\longrightarrow$   $Y_{ijk} = \alpha_0 + \beta_W \left(PRS_{ijk} - \overline{PRS_j} - \overline{PRS_k}\right) + \beta_{BF} \left(\overline{PRS_j} - \overline{PRS_k}\right) + \beta_{BR} \left(\overline{PRS_k}\right) + \gamma_j + \gamma_k + \varepsilon_{ijk}$ 

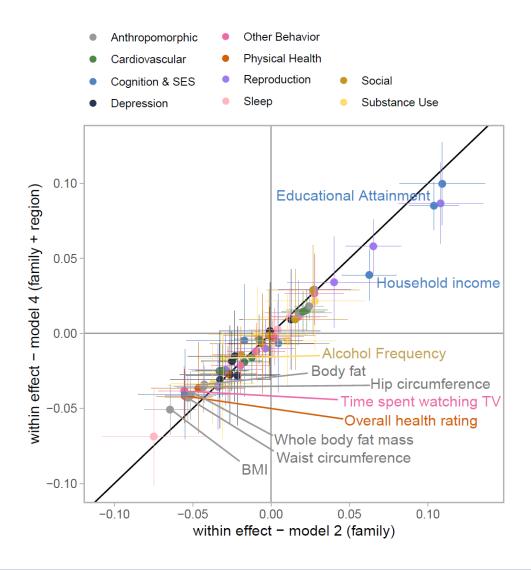
> Betweenfamily effect











Adding geography significantly decreased withinfamily effect for 10 traits. The most significant 5:

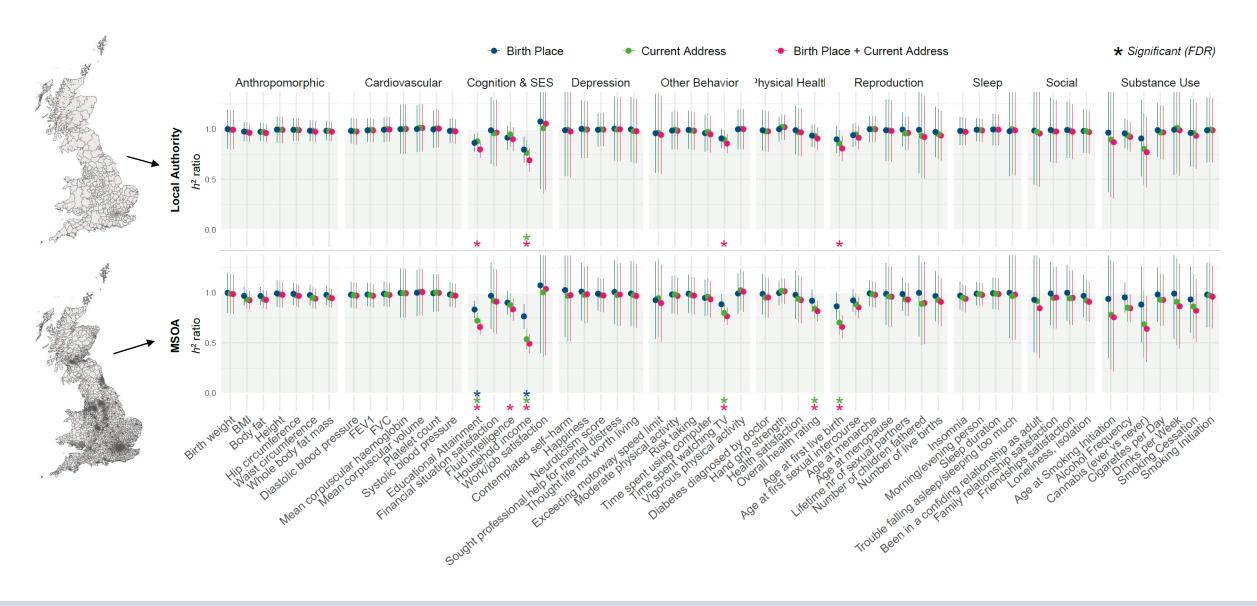
- BMI  $(p = 1 \times 10^{-5})$
- Waist circumference ( $p = 1 \times 10^{-4}$ )
- Household income ( $p = 1 \times 10^{-4}$ )
- Time spent watching TV ( $p = 3 \times 10^{-4}$ )
- Whole body fat mass  $(p = 6 \times 10^{-4})$

These are traits that are more subject to change after siblings migrated out of the parental residence.

**GWASs Controlled for Geography** 

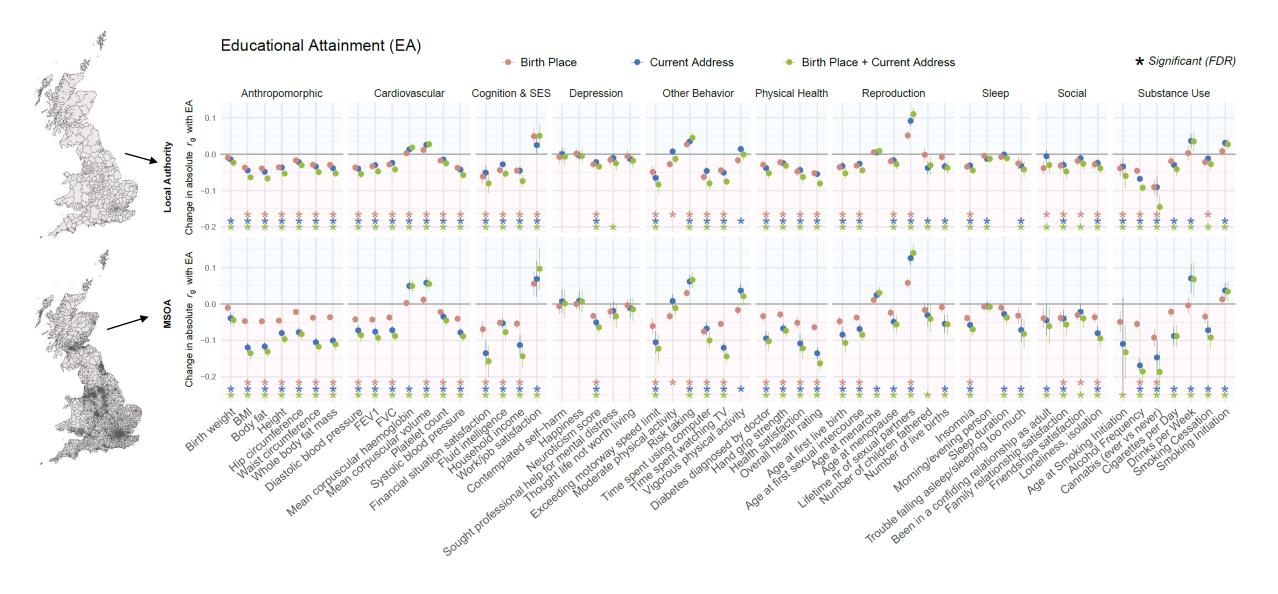
# Genome-Wide Association Study (GWAS) Single Nucleotide Polymorphism (SNPs) We conducted GWASs on 56 complex traits, with and without controlling for geography. Question Very often Often Sometimes CC CT CA TA 10

### Changes in SNP-based heritability



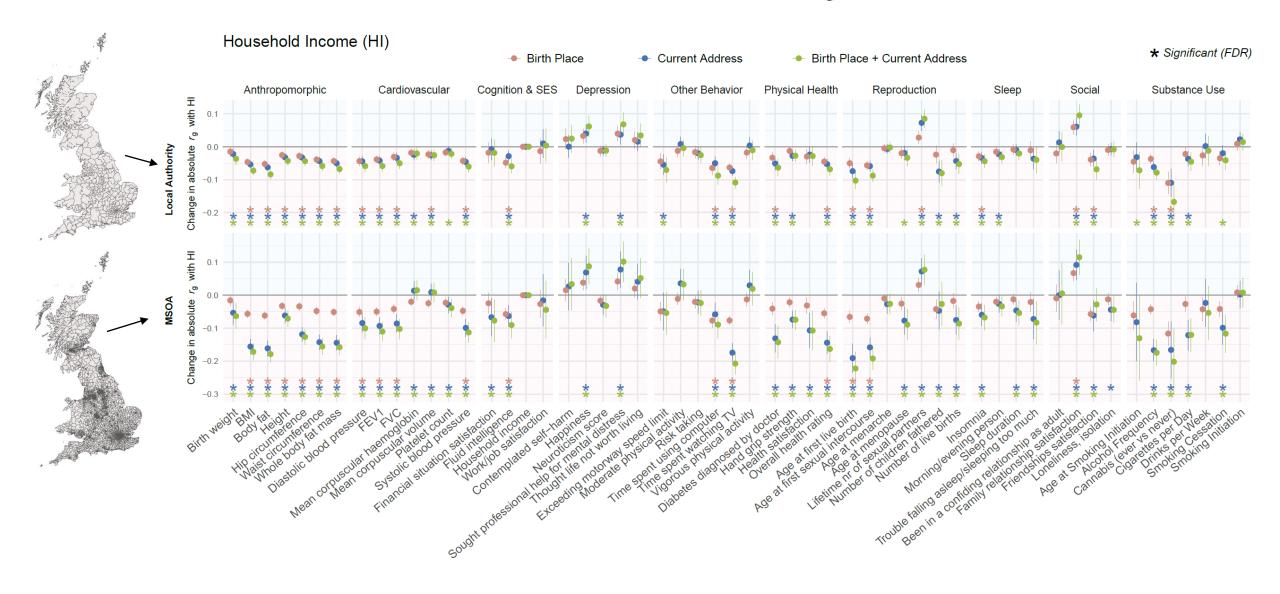
### Changes in genetic correlation with SES - Educational Attainment





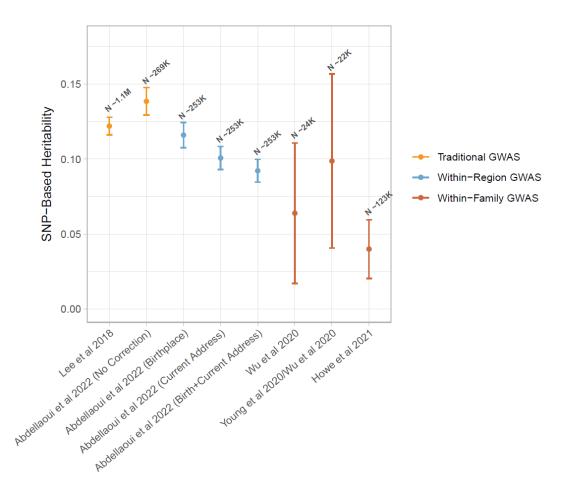
### Changes in genetic correlation with SES - Household Income





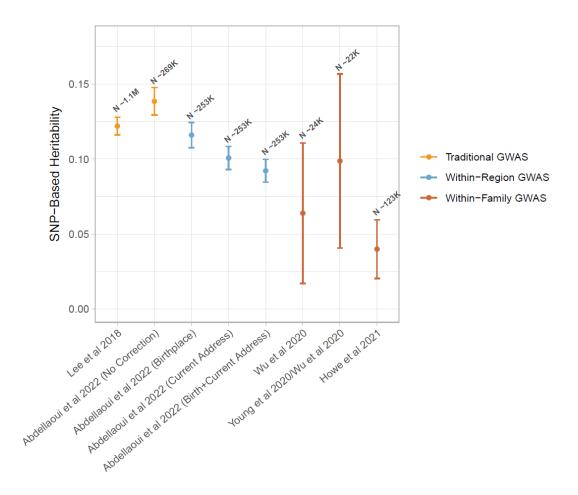
# Summary

 Controlling for geographic region decreases the heritability for SES (education/income)



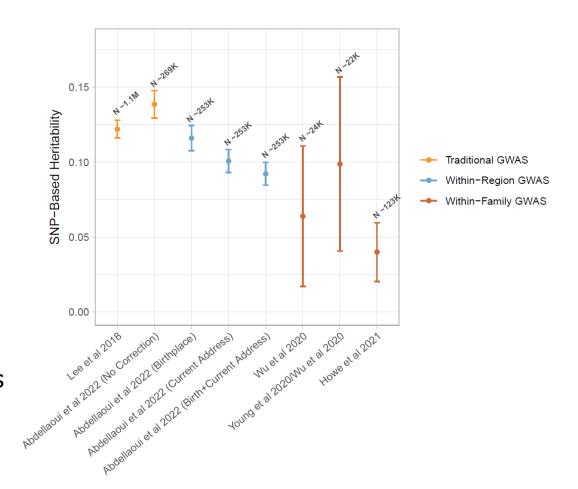
# Summary

- Controlling for geographic region decreases the heritability for SES (education/income)
- Controlling for region reduces genetic correlations with SES (EA/income), most significantly for BMI, sedentary behavior, and substance use



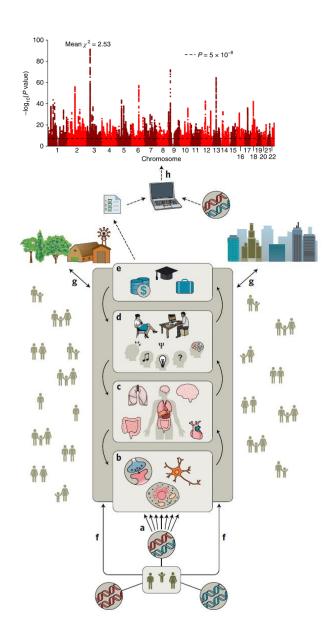
# Summary

- Controlling for geographic region decreases the heritability for SES (education/income)
- Controlling for region reduces genetic correlations with SES (EA/income), most significantly for BMI, sedentary behavior, and substance use
- Our findings can be explained driven by both passive and active gene-environment correlations



# Key points

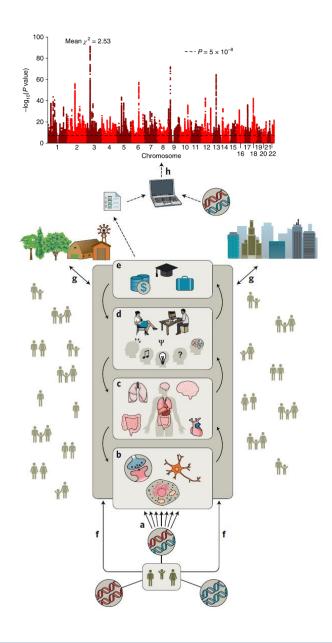
Society makes genetic effects stronger.



# Key points

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We reward certain genetic propensities with a better environment, and "punish" the lack of those propensities with a worse environment.



# Key points

Society makes genetic effects stronger.

We reward certain genetic propensities with a better environment, and "punish" the lack of those propensities with a worse environment.

This makes society more unequal.

This makes studying genetics more difficult.

