Add Health **Genetic Data** and Genome-Wide Association Study

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Credit : Lauren Solomon, Broad Communications



### Outline

- GWAS background
- Rationale
- Conducting a GWAS
- Recent examples
- AddHealth genotyping data
- Potential uses
- Resources





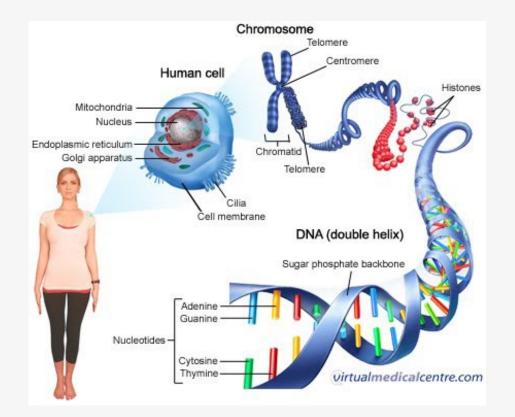
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#### **Background - DNA**







## Background - SNPs

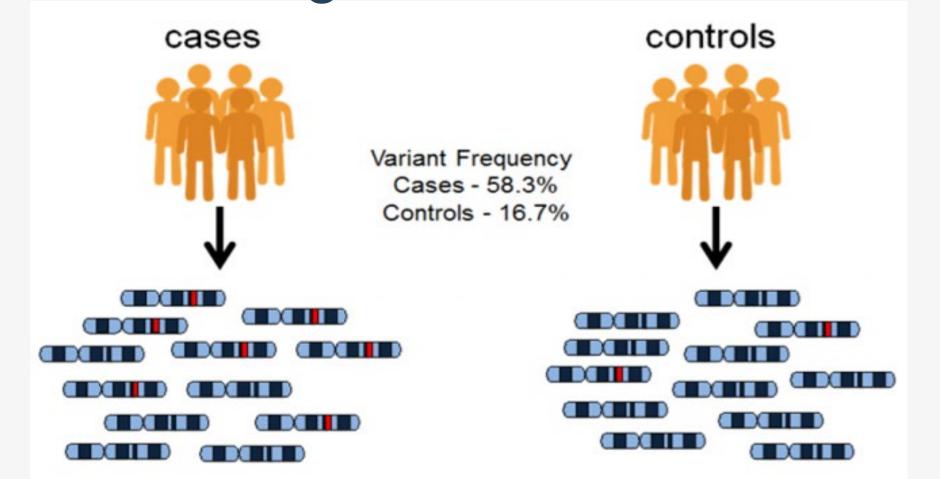
| romosome 19 449111844491119444911204   |                  |  |  |  |  |  |
|--|------------------|--|--|--|--|--|
| ConsensusCGATATTCC <mark>C</mark> ATCGAATGTC Chr19:44911194C   |                  |  |  |  |  |  |
| Individual 1a …CGATATTCC <mark>T</mark> ATCGAATGTC… Chr19:44911194C>T<br>Individual 1b …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C |                  |  |  |  |  |  |
| Individual 1 Chr19:44911194 <mark>T</mark> ,   | / <mark>C</mark> |  |  |  |  |  |
| Individual 2a …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C<br>Individual 2b …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C   |                  |  |  |  |  |  |
| Individual 2 Chr19:44911194 <mark>C</mark> ,   | / <mark>C</mark> |  |  |  |  |  |
| Individual 3a …CGATATTCC <mark>T</mark> ATCGAATGTC…  |                  |  |  |  |  |  |
| Individual 3 Chr19:44911194 <mark>T</mark> ,   | / <mark>T</mark> |  |  |  |  |  |
| Individual 4a …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C<br>Individual 4b …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C   |                  |  |  |  |  |  |
| Individual 4 Chr19:44911194 <mark>C</mark> ,   | / <mark>C</mark> |  |  |  |  |  |
| Individual 5a …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C<br>Individual 5b …CGATATTCC <mark>C</mark> ATCGAATGTC… Chr19:44911194C   |                  |  |  |  |  |  |



Individual 5 Chr19:44911194 C/C



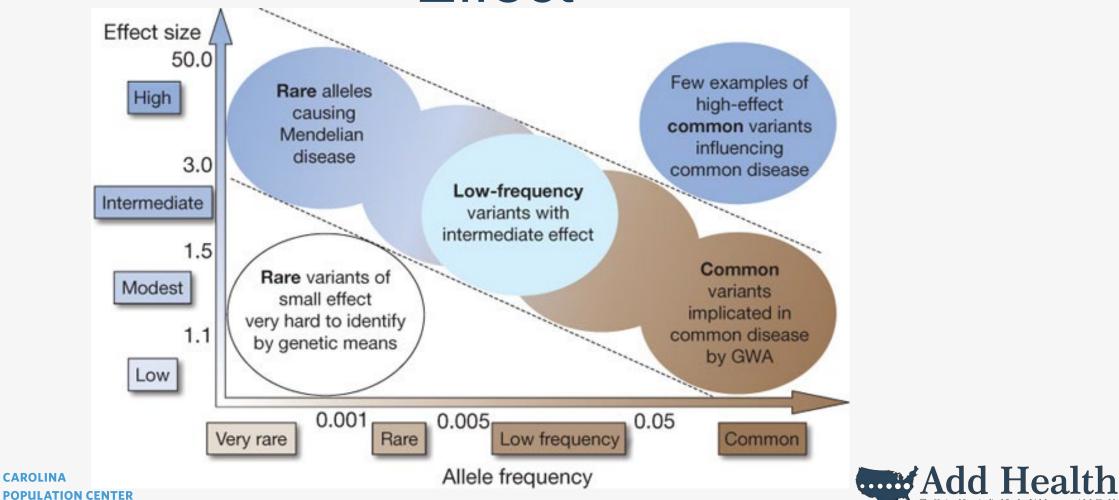
#### **Background - GWAS**

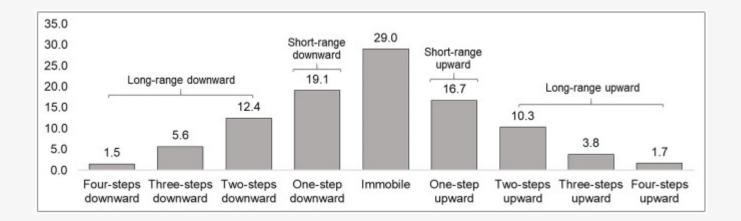






#### Background – SNP Frequency and Effect





Gugushvili A, Bulczak G, Zelinska O, Koltai J. Socioeconomic position, social mobility, and health selection effects on allostatic load in the United States. PLoS One. 2021 Aug 4;16(8):





#### GAS Power Calculator Home About Tutorial Reference

#### About GAS Power Calculator

This Genetic Association Study (GAS) Power Calculator is a simple interface that can be used to compute statistical power for large one-stage genetic association studies. The underlying method is derived from the CaTS power calculator for two-stage association studies (2006).

| Inputs                       |                                |                        | Graph   |
|------------------------------|--------------------------------|------------------------|---|
|                              | Sample Size                    | Cases/Controls = 0.058 | Statistical Power vs. Cases + Controls -  |
| Cases                        |                                | 550                    | Click and drag in the plot area to zoom in  |
| Controls                     |                                | 9450                   |   |
|                              | Study Design                   |                        | 0.8   |
| Significance<br>Level        |                                | 0.0000100              |   |
| Level                        | Disease Model Multiplicative - |                        | and Downer  |
| 5                            |                                |                        |   |
| Prevalence<br>Disease Allele |                                | 0.0550                 |   |
| Frequency                    |                                | 0.5000                 | 0.2   |
| Genotype<br>Relative Risk    |                                | 1.2500                 |   |
|                              |                                |                        | 100 200 400 1k 2k 4k 10k 20k 40k 100k<br>Cases + Controls   |
|                              |                                |                        | The second se |
| Results                      |                                |                        |   |
| Expected power               | for a one-stage study          | 0.273                  |   |
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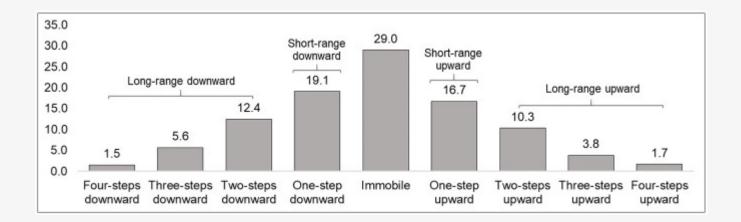
Add Health The National Longitudinal Study of Adolescent to Adult Health

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| Significance<br>Level       |                                | 0.0000100              | ğ 0.6  |
|                             | Disease Model Multiplicative • |                        | attractal Po   |
| Prevalence                  |                                | 0.0550                 | <b>8</b> 0.4   |
| Disease Allele<br>Frequency |                                | 0.5000                 | 0.2  |
| Genotype<br>Relative Risk   |                                | 1.5000                 |  |
|                             |                                |                        | 0 200 400 1k 2k 4k 10k 20k 40k 100k<br>Cases + Controls Highcharts.com |
| Results                     |                                |                        |  |
| Expected power              | for a one-stage study          |                        | 0.994  |
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Gugushvili A, Bulczak G, Zelinska O, Koltai J. Socioeconomic position, social mobility, and health selection effects on allostatic load in the United States. PLoS One. 2021 Aug 4;16(8):





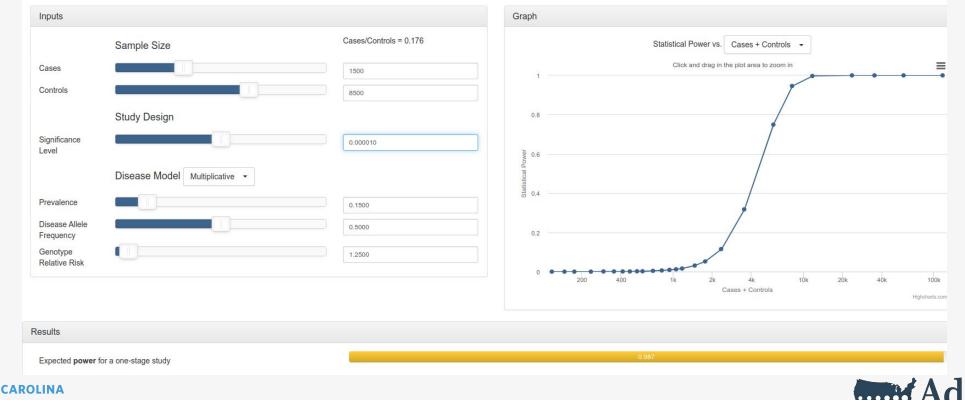
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#### About GAS Power Calculator

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- GWAS background
- Rationale
- Conducting a GWAS
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#### Rationale

#### Intellectual

#### **Biomedical**

biological contribution to outcomes
evolutionary past
family history

drug targets
biomarkers
disease subtyping Public Health

• at risk populations

 preventative practices

 genetic counseling

 Prenatal/newbor ne screening

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#### Rationale

- What proportion of outcome is due to subjects' genes?
- Which populations are most likely to develop outcome?
- Are there **mitigating biological factors** that limit the connection between my exposure and outcome of interest?
- Does my outcome of interest share genetic predisposition
  to other outcomes?
- Does the **environment** of my subjects conspire with genetic elements in an unpredictable way?





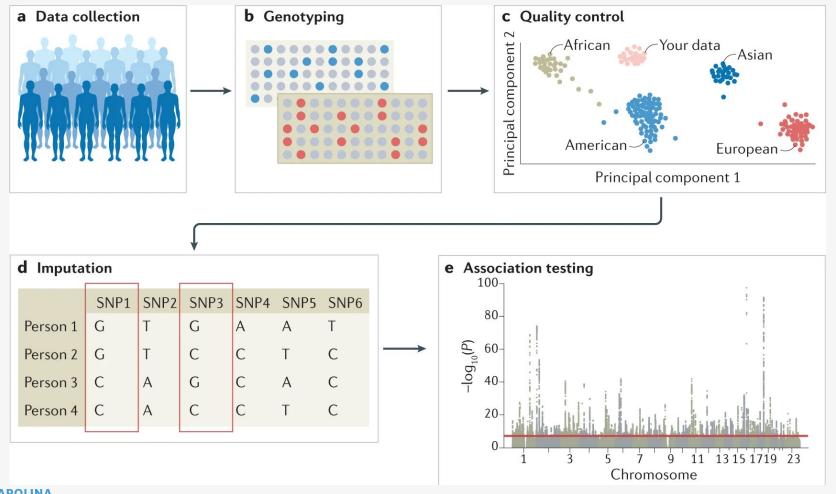
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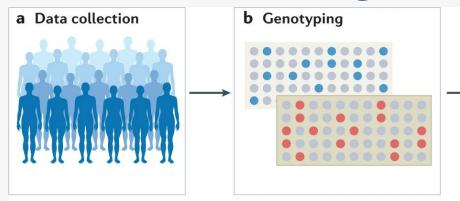
### Conducting a GWAS - Outline





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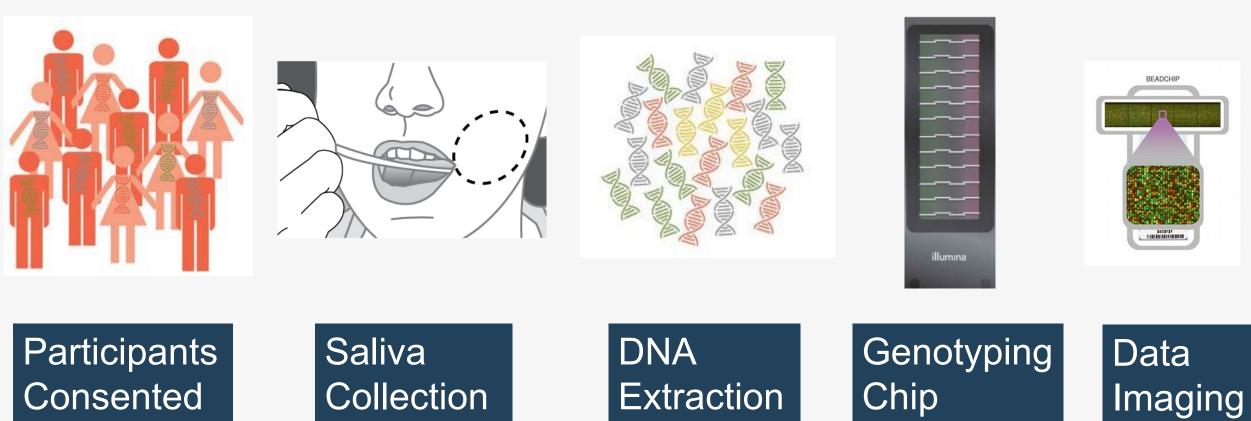
#### Conducting a GWAS - Outline







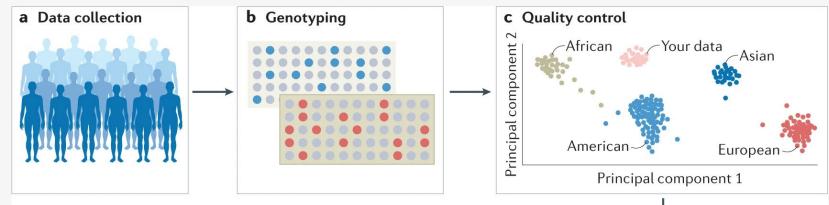
#### Conducting a GWAS – Data Collection





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#### Conducting a GWAS - Outline





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# Conducting a GWAS – Sample QC

- Remove participants with call rate <90% (n=373)
- Remove participants with poor duplicate concordance (n=14)
- Remove participants with sex discordance or unclear sex chromosomes (n=177)
- Remove participants with **identifier abnormalities** (n=3)
- Yielded n=11554 participants passing quality control



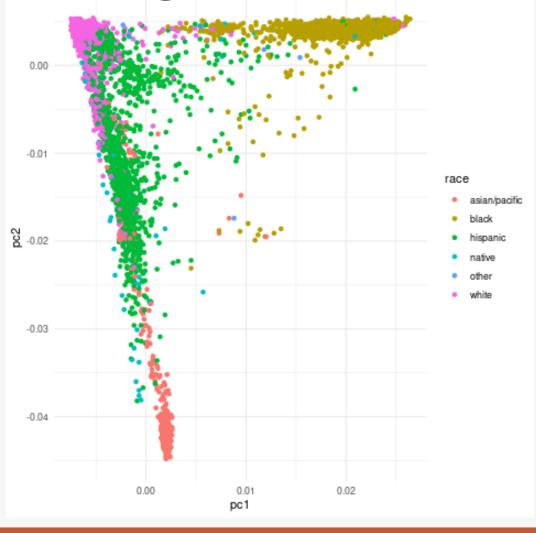


# Conducting a GWAS – Sample QC

- Variants on **Omni1** = 1,058,111 / **Omni2.5** = 2,369,541
- Variants removed for failure to map (n=142,695)
- Variants removed for triallelic status (n=1,985)
- Variants removed for low call rate (n=20,008 / 56,182)
- Variants removed for **rarity** (n=33,333 / 571,200)
- Variants removed for **HWE** (n=7953 / 4,607)
- Variants removed for duplicate discordance
- Yielded n=609,130 variants



#### **Conducting a GWAS - Ancestry**

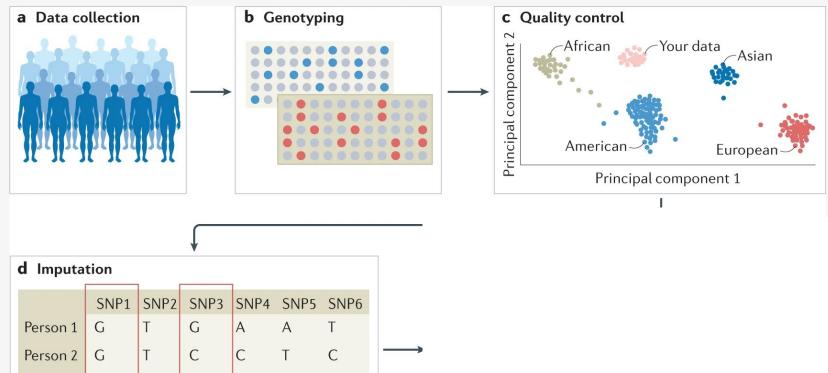


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### Conducting a GWAS - Outline





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Person 3

Person 4

С

С

G

С

A

А

С

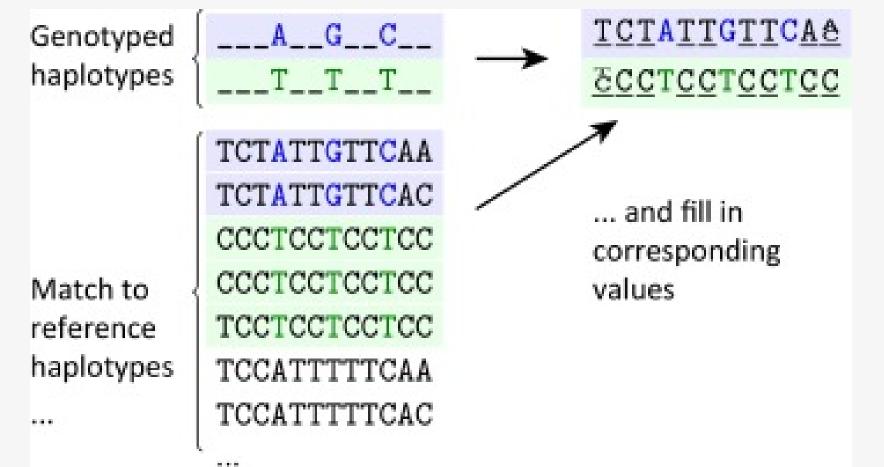
С

А

С

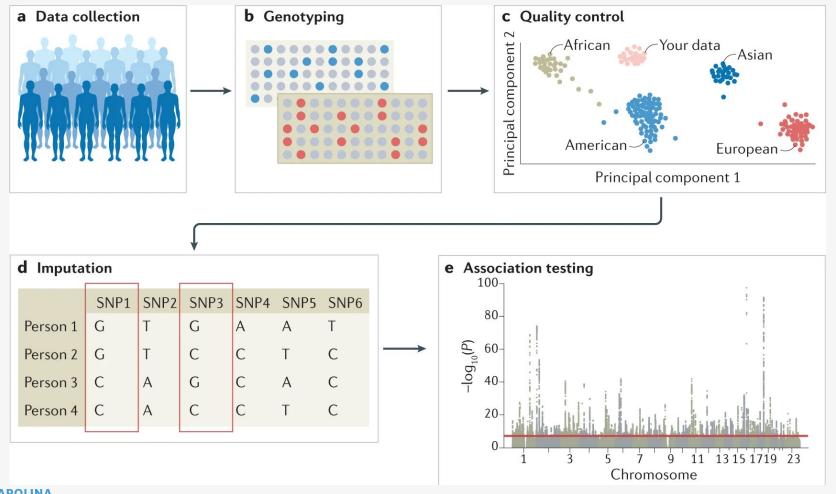
С

#### **Conducting a GWAS - Imputation**



 Trends in Genetics Add Health

### Conducting a GWAS - Outline





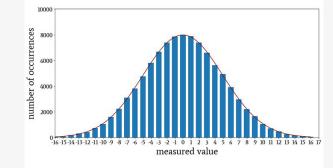
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## Conducting a GWAS - Outcome

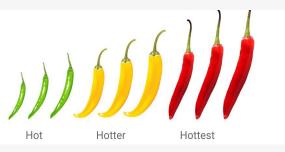
#### Dichotomous



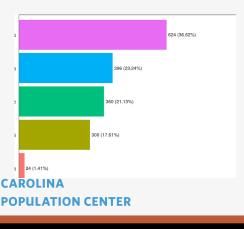
#### Quantitative



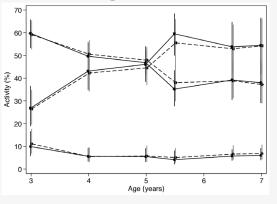
#### Ordinal



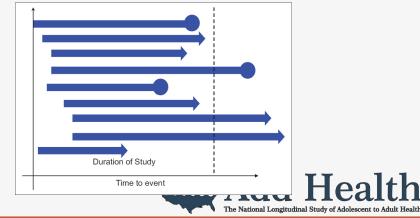
Categorical



Longitudinal



Time to Event



# Conducting a GWAS – Finding Associations

#### dragontaoran/ SUGEN



 $\bigcirc$ 

Genetic Association Analysis Under Complex Survey Sampling

- A 1 ② 0 ☆ 10 ジ 1 Contributor Issues Stars Fork
- Allows for family correction

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- Allows for heteroscedastic variance flags
- Accommodates GWAS, GWEIS



## Conducting a GWAS – Results

| CHROM | POS      | VCF_ID      | REF | ALT | ALT_AF | N_INFORMATIVE | BETA  | SE    | PVALUE  |
|-------|----------|-------------|-----|-----|--------|---------------|-------|-------|---------|
| 22    | 49262800 | 22:49262800 | Т   | С   | 0.27   | 9939          | 0.34  | 0.087 | 9.9e-05 |
| 22    | 23266118 | 22:23266118 | А   | G   | 0.50   | 9939          | -0.14 | 0.038 | 1.4e-04 |
| 22    | 50460076 | 22:50460076 | G   | Т   | 0.10   | 9939          | 0.25  | 0.066 | 2.0e-04 |
| 22    | 23268052 | 22:23268052 | Α   | G   | 0.50   | 9939          | -0.14 | 0.039 | 2.7e-04 |
| 22    | 19846611 | 22:19846611 | СТ  | С   | 0.10   | 9939          | -0.34 | 0.095 | 2.8e-04 |
| 22    | 32729773 | 22:32729773 | C   | Т   | 0.57   | 9939          | -0.14 | 0.040 | 3.4e-04 |
|       |          |             |     |     |        |               |       |       |         |

- Results filtered for
- Minor allele frequency
- Imputation quality
- Effective population size





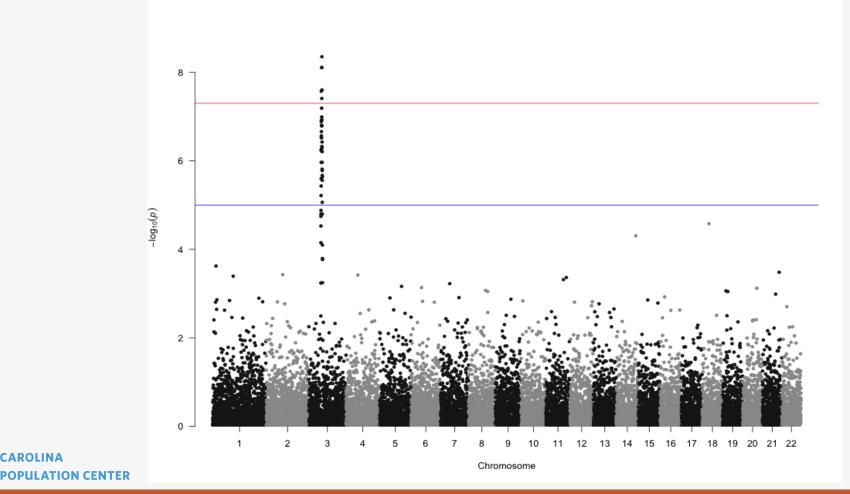
# Conducting a GWAS – Interpretation

- Number of significant hits (n)
- Multiple hits in a single gene (clustering of hits)
- Degree of **significance** (p value)
- Strength of association (beta)
- Inclusion of hits in gene set
- Functional effect of mutation





### Conducting a GWAS – Visualization



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#### **Recent Examples – Social Isolation**



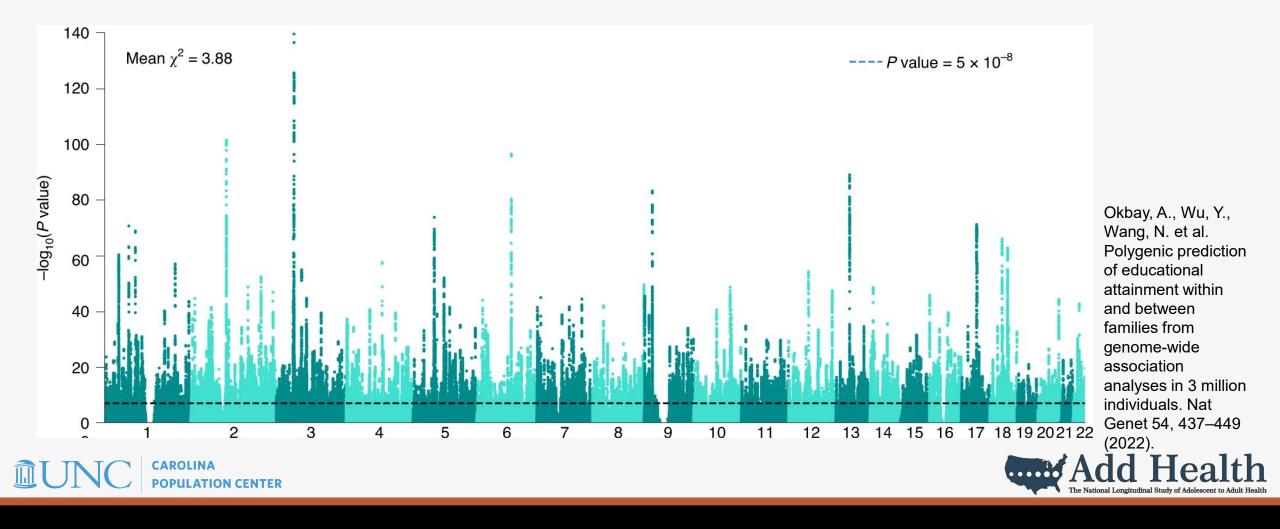
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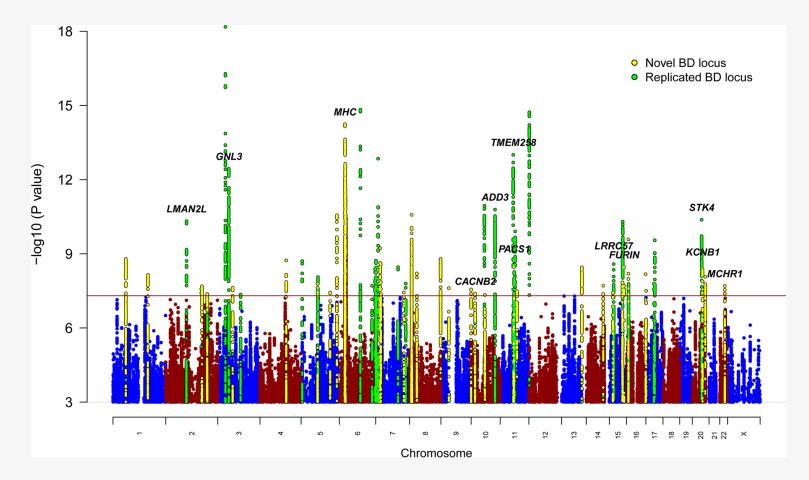
Day, F.R., Ong, K.K. & Perry, J.R.B. Elucidating the genetic basis of social interaction and isolation. Nat Commun 9, 2457 (2018).



#### Recent Examples – Educational Attainment



#### Recent Examples – Bipolar Disorder



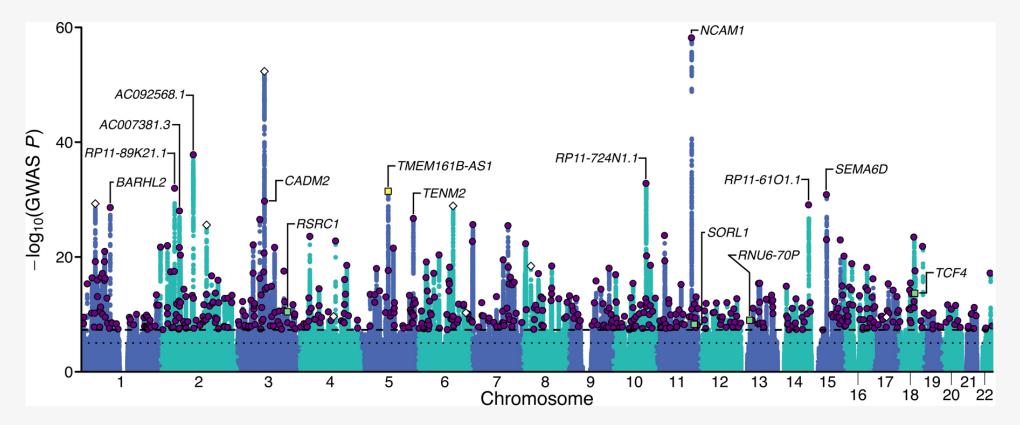
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Mullins N, Forstner AJ, et al., Andreassen OA. Genome-wide association study of more than 40,000 bipolar disorder cases provides new insights into the underlying biology. Nat Genet. 2021 Jun;53(6):817-829.



#### Recent Examples – Behavioral Regulation



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Karlsson Linnér R,...Dick DM. Multivariate analysis of 1.5 million people identifies genetic associations with traits related to self-regulation and addiction. Nat Neurosci. 2021 Oct;24(10):1367-1376.

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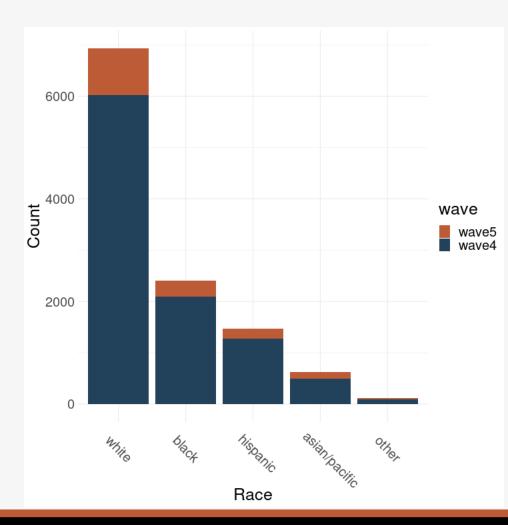
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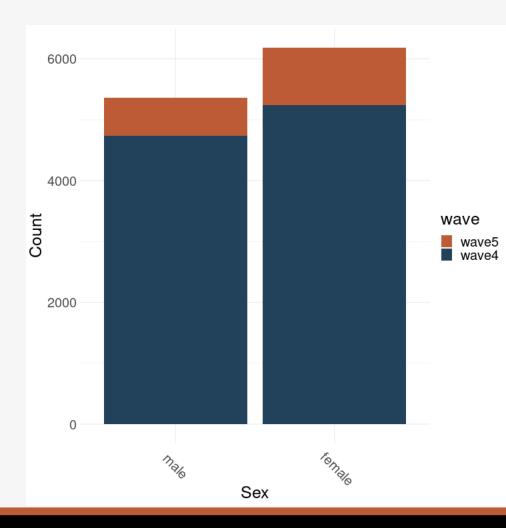
# AddHealth Genotyping Data - Race





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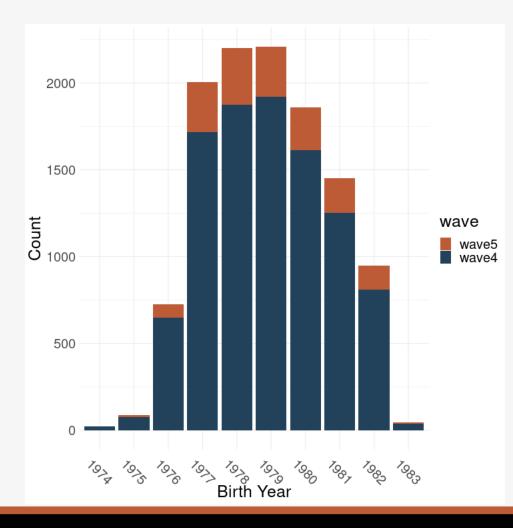
# AddHealth Genotyping Data - Sex



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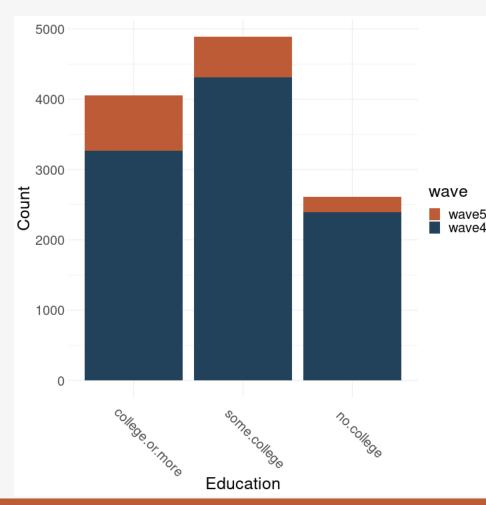
# AddHealth Genotyping Data – Birth Year



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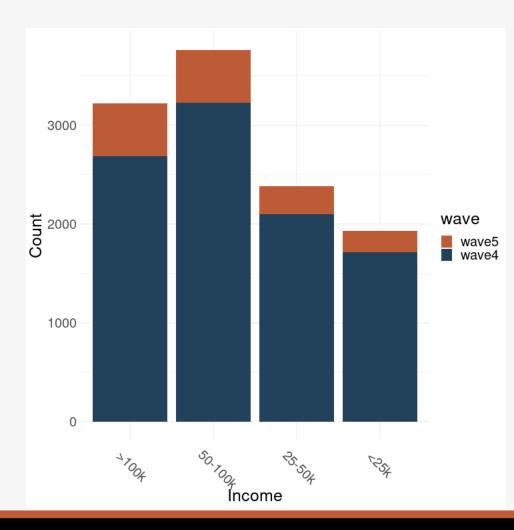
#### AddHealth Genotyping Data – Educational Attainment



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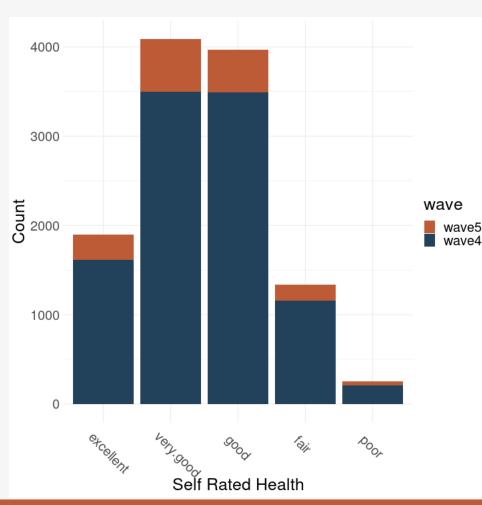
# AddHealth Genotyping Data - Income





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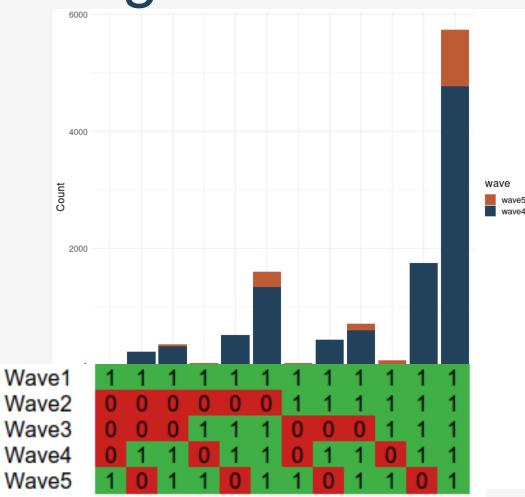
#### AddHealth Genotyping Data – Self Rated Health



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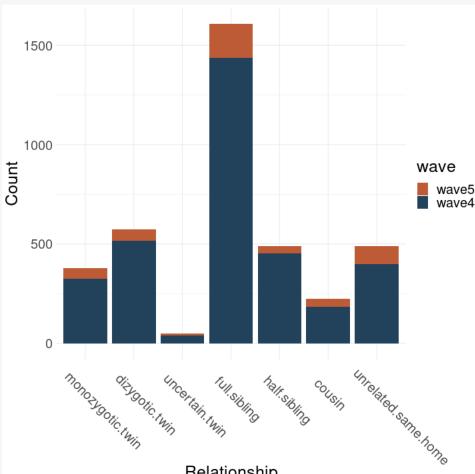
#### AddHealth Genotyping Data – Longitudinal Pattern





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# AddHealth Genotyping Data – Nested Pairs







Relationship

#### AddHealth Genotyping Data – Overlap With Other Data

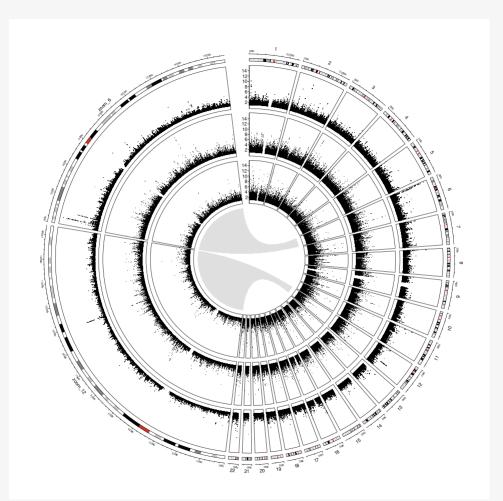


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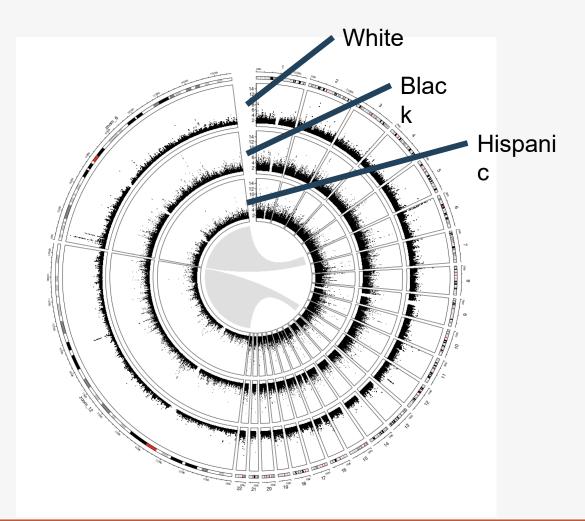






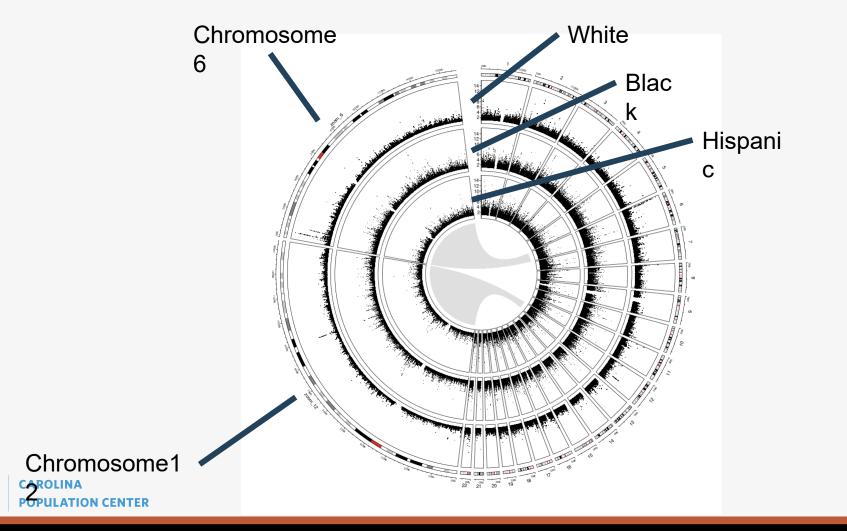




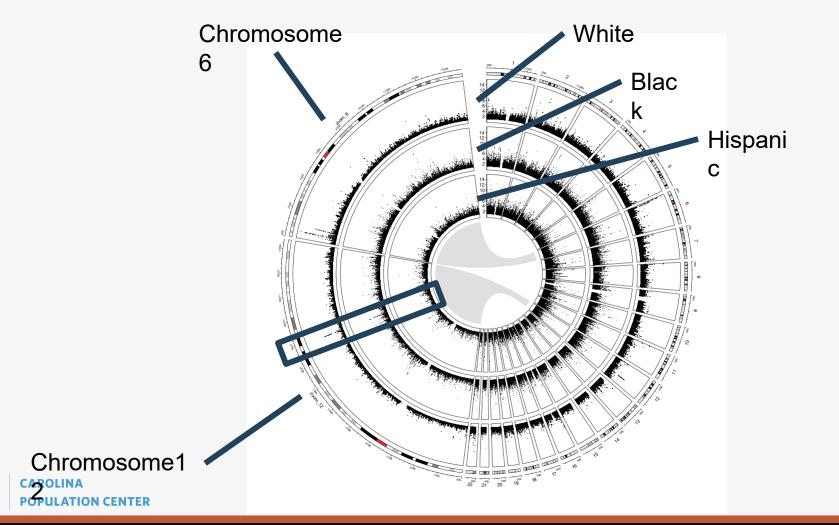




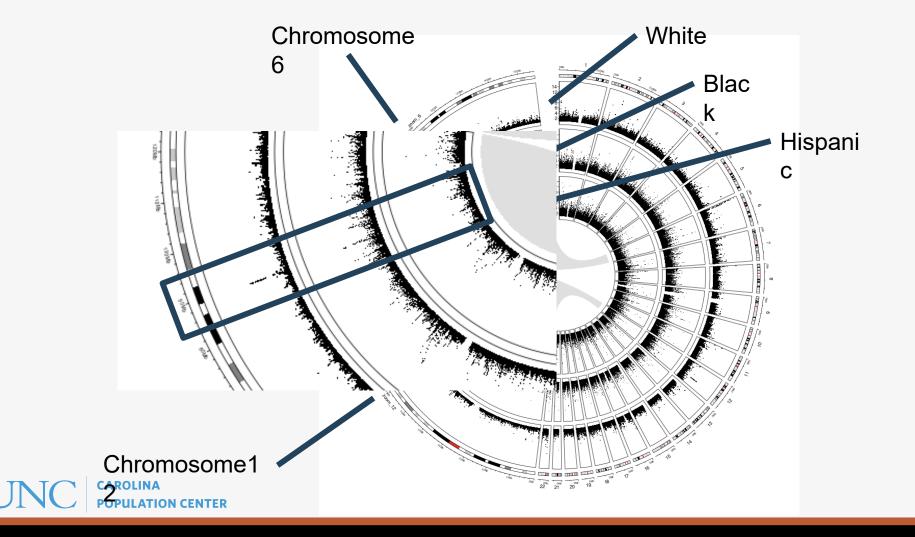




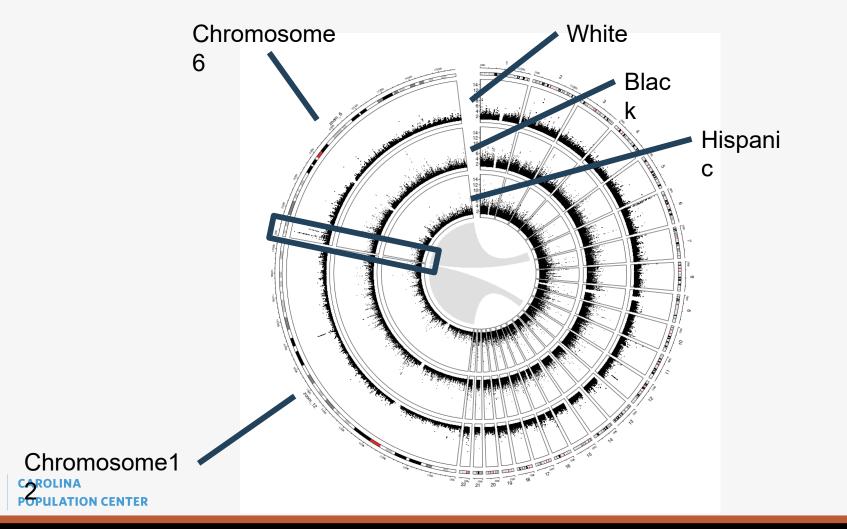




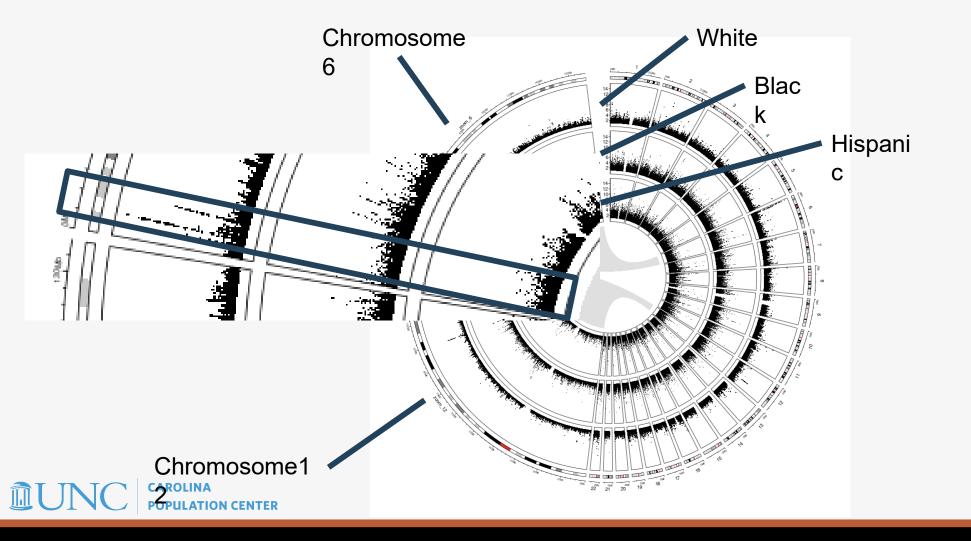






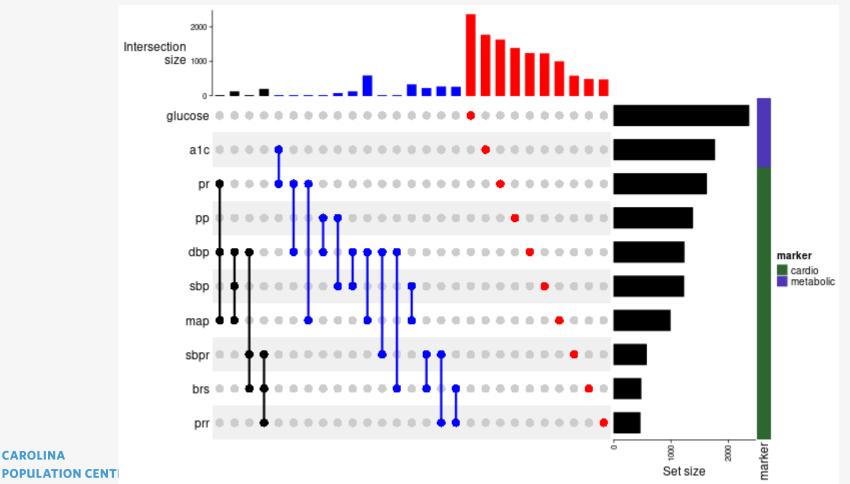








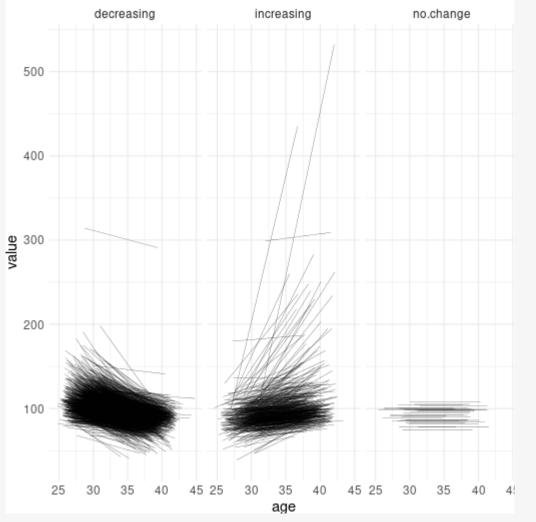
#### **Shared Genetic Variation**



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# **Longitudinal Phenotypes**

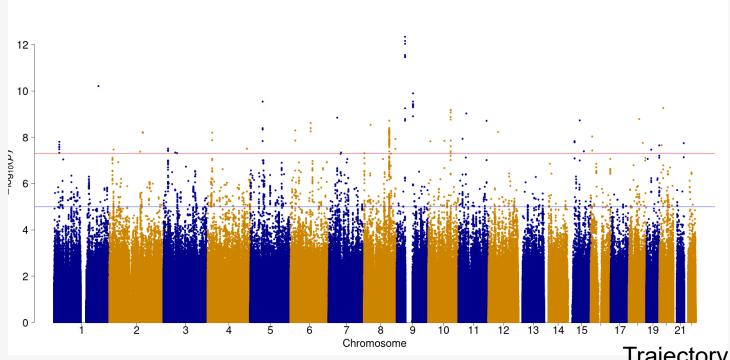


Trajectory of blood glucose during adolescence



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# Longitudinal Phenotypes



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Trajectory of blood glucose during adolescence



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#### Resources

https://www.ncbi.nlm.nih.gov/projects/gap/cgi-bin/study.cgi?study\_id=phs001367.v1.p1

https://addhealth.cpc.unc.edu/about/omics

addhealth\_genetics@unc.edu



