

Prof. dr. D.L. Knook lezing : Tweelingen en veroudering

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Tweelingen, genetica en levensloop.

MZ

# Why Twins

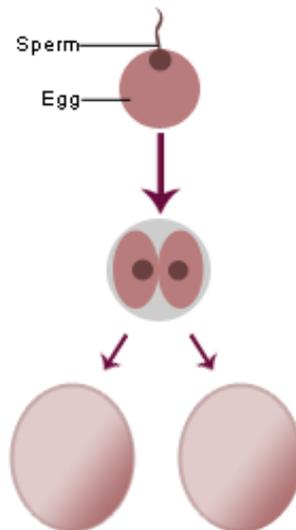
DZ

Classical twin design:  
heritability =  $2(r_{MZ} - r_{DZ})$   
(where r stands for correlation)

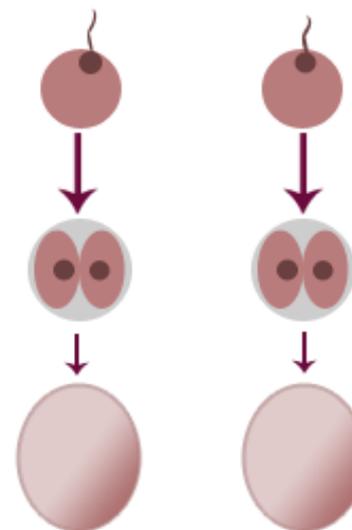
Monozygotic (MZ) :  
"100% " genetically identical

Dizygotic (DZ):  
Share 50% of segregating genes

a) Identical (Monozygotic) Twins

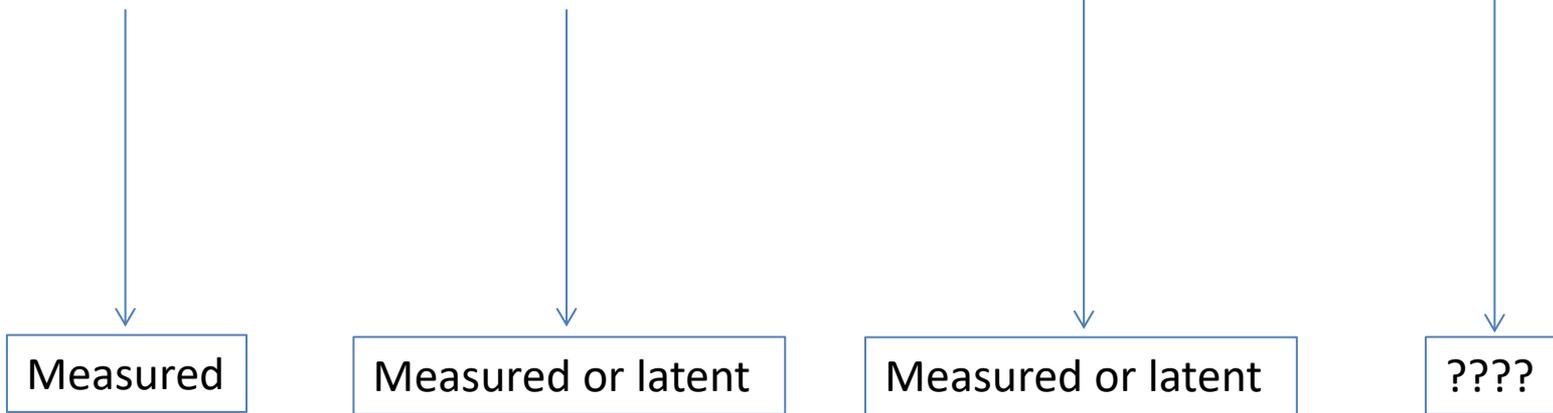


b) Fraternal (Dizygotic) Twins



# Biometrical model

**Phenotype = Genes + Environment + Chance**



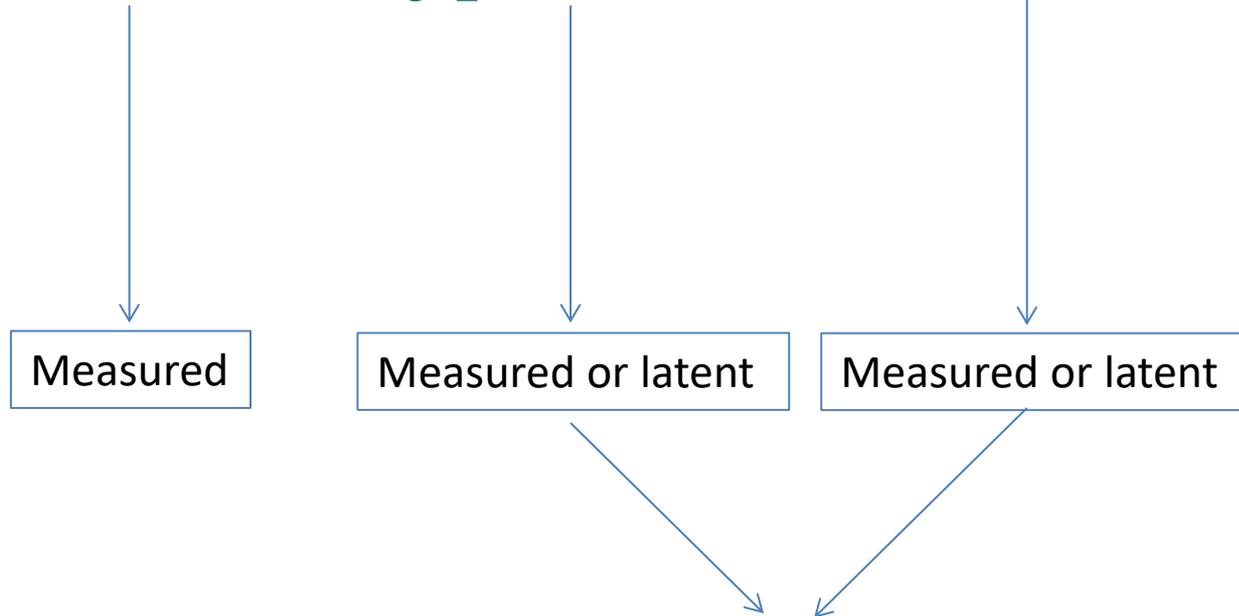
# **Biometrical model**

$$**P = G + E + Chance**$$

$$**Variation (P) = Variation (G) + Variation (E)**$$

# Biometrical model

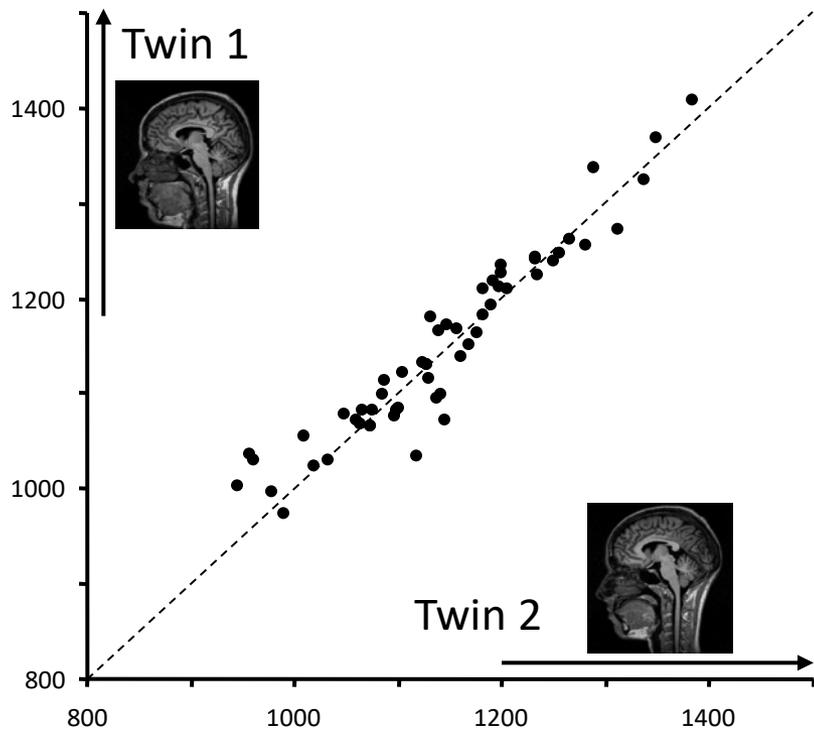
$$\text{Phenotype} = \text{Genes} + \text{Environment}$$



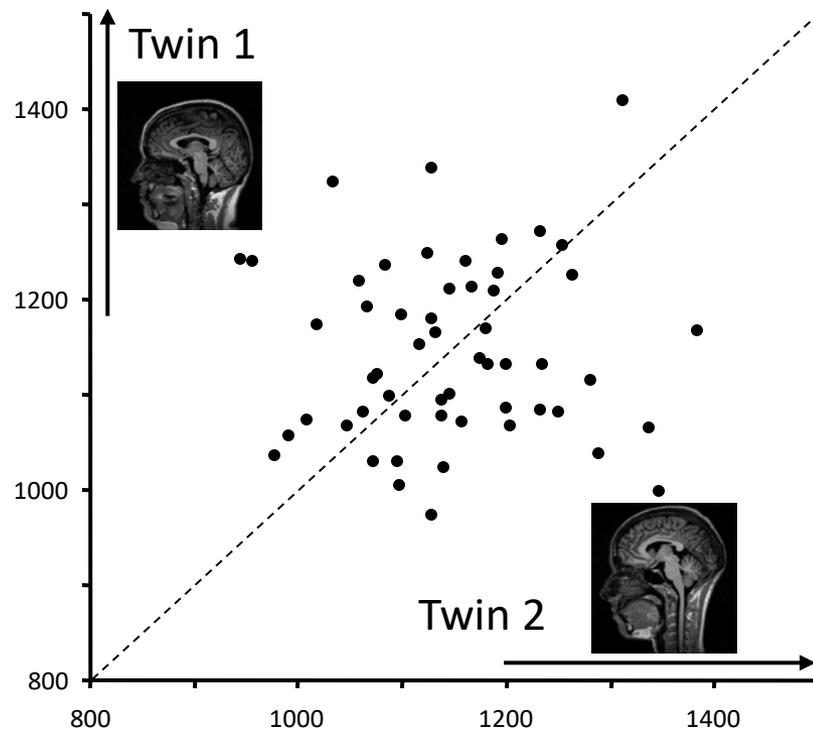
**When both are not directly measured (unobserved or latent) we apply a twin, adoption, or family design and methods from genetic epidemiology and behavior genetics to estimate genetic and non-genetic variation.**

**Adoptions of twins into separate homes are rare.**

**The classic twin design relies on comparing resemblance of mono- and dizygotic twin pairs reared together.**



Brain volume MZ twin pairs  
(milliliter) in twin and co-twin

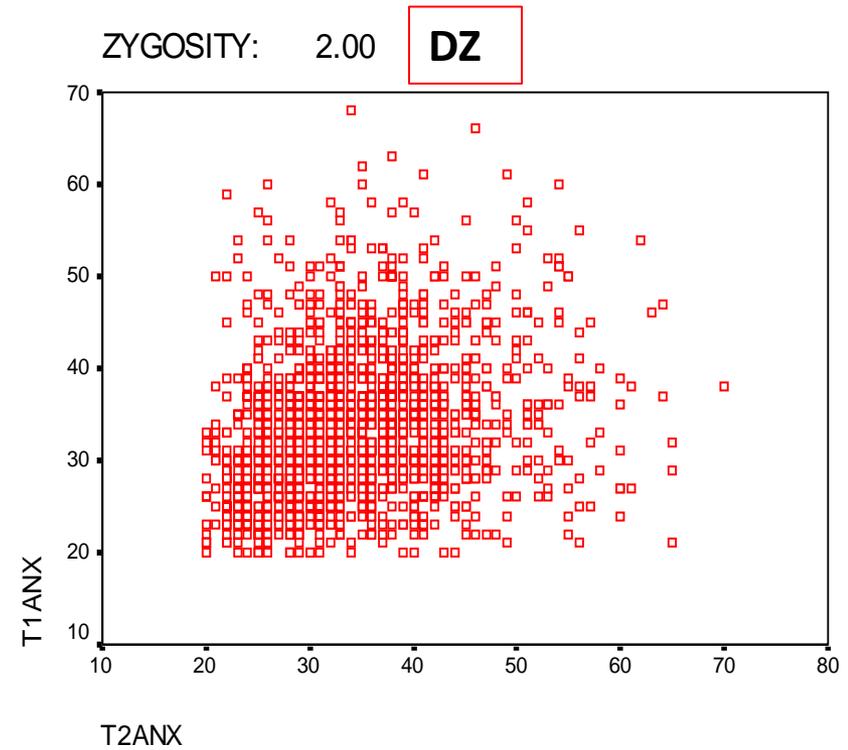
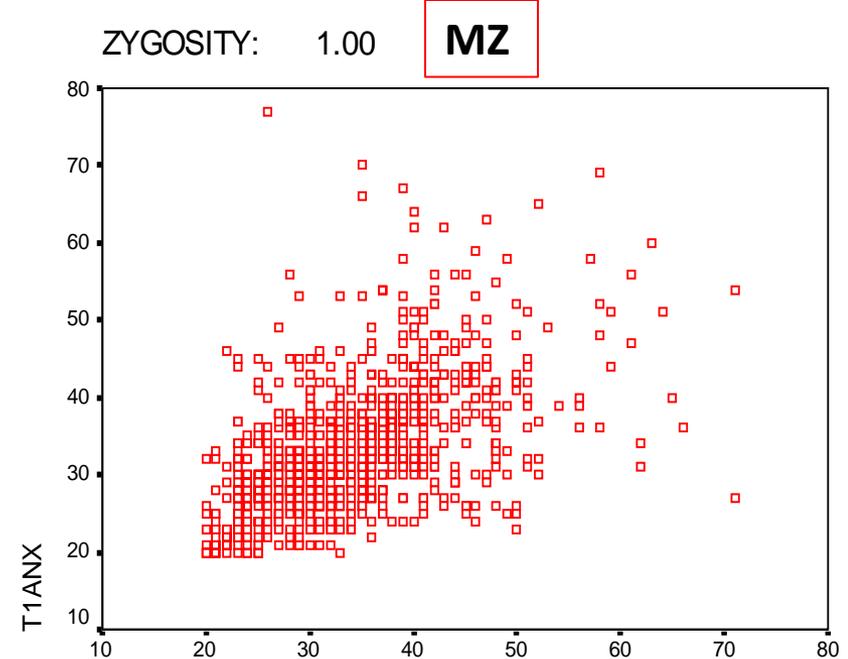


Brain volume DZ twin pairs  
(milliliter) in twin and co-twin

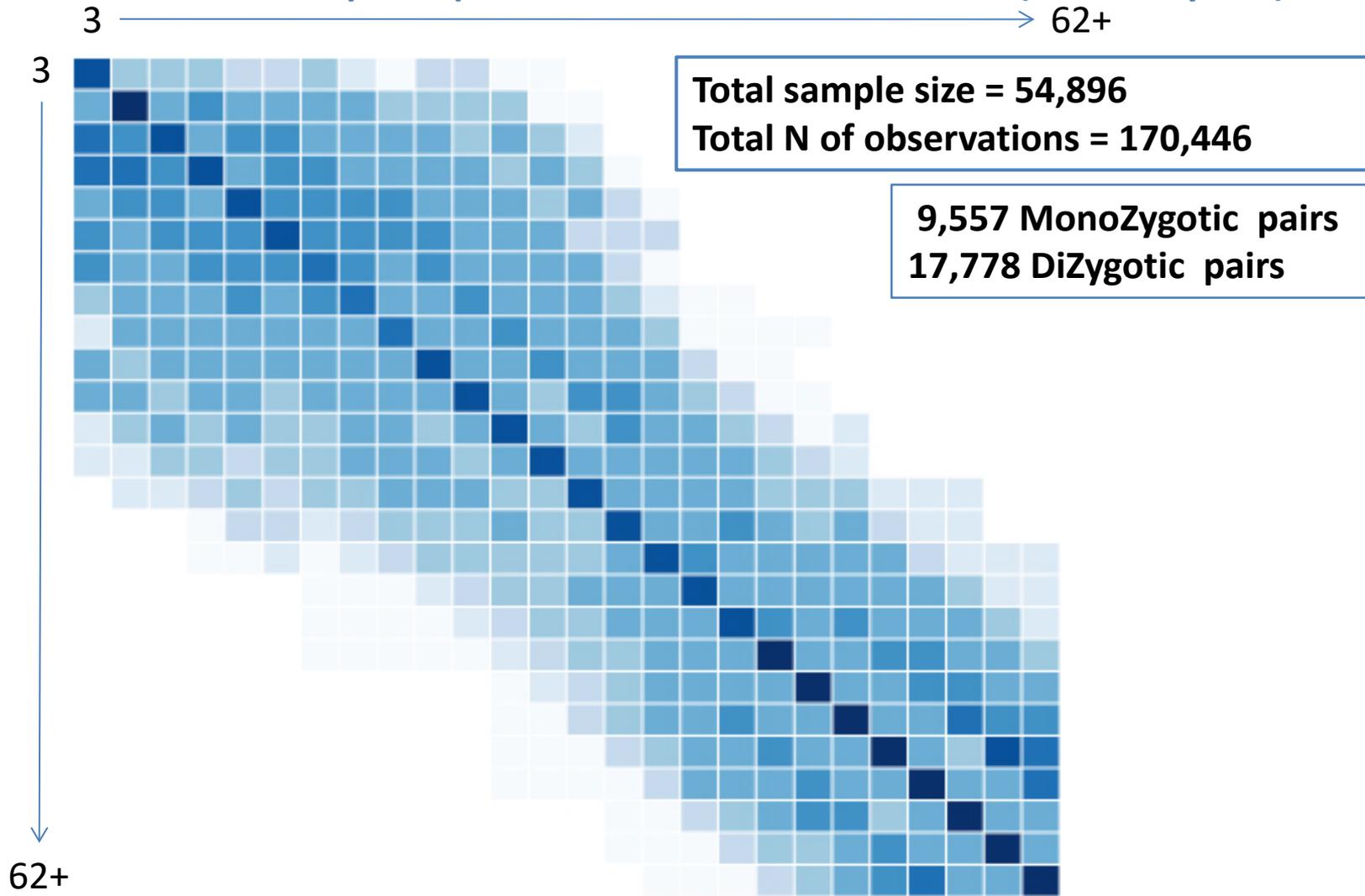
**Example: MRI-based Brain volumes**  
**Resemblance of MZ ('identical') and DZ twins (sibs)**

# Twin Model

- Twin correlations for anxiety (young adult twins)
- Correlation (MZ) = 0.54
- Correlation (DZ) = 0.25
- Difference =  $.54 - .25 = .29$
- Heritability =  $2 * .29 = 58\%$

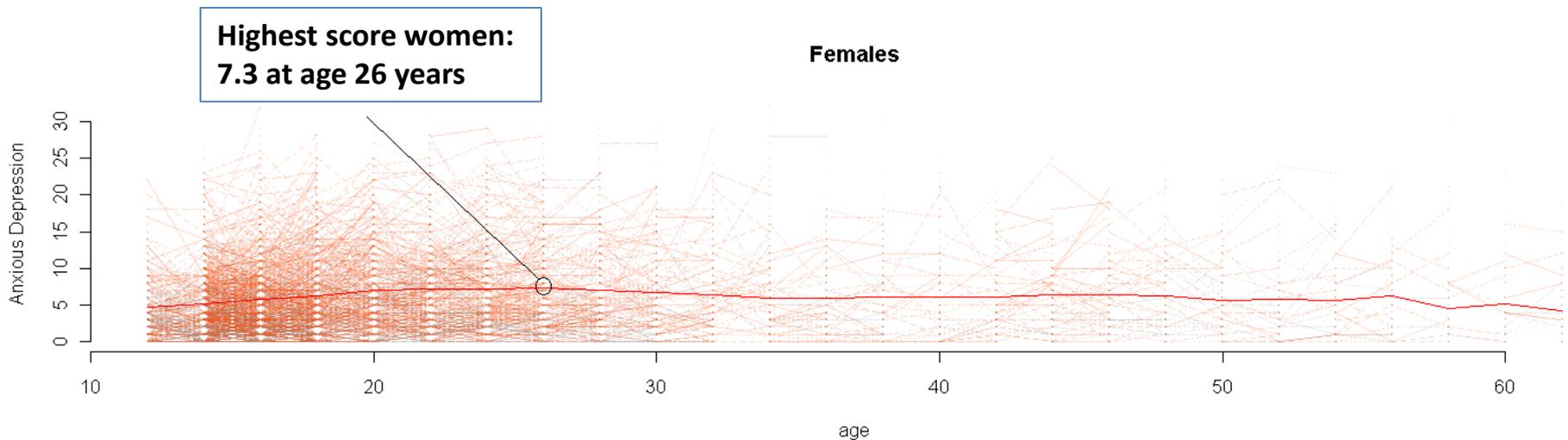
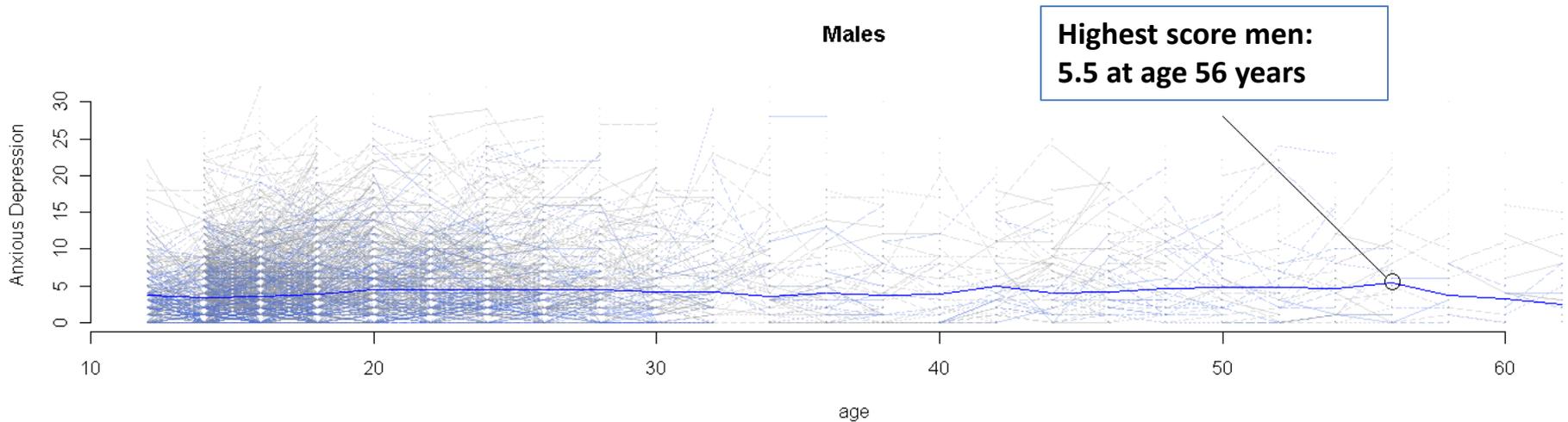


# Longitudinal data: each participant is at most rated 8 or 9 times (over ~20 years).



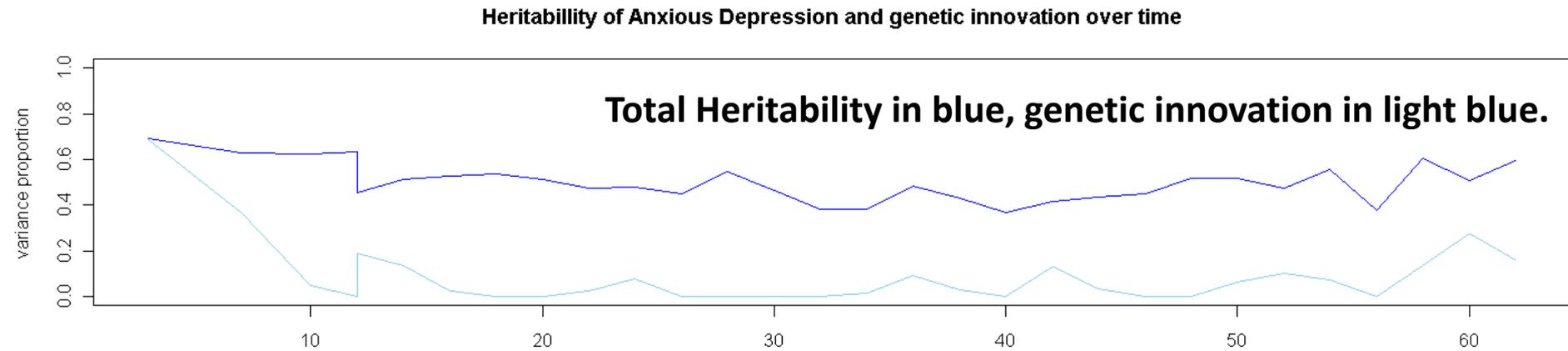
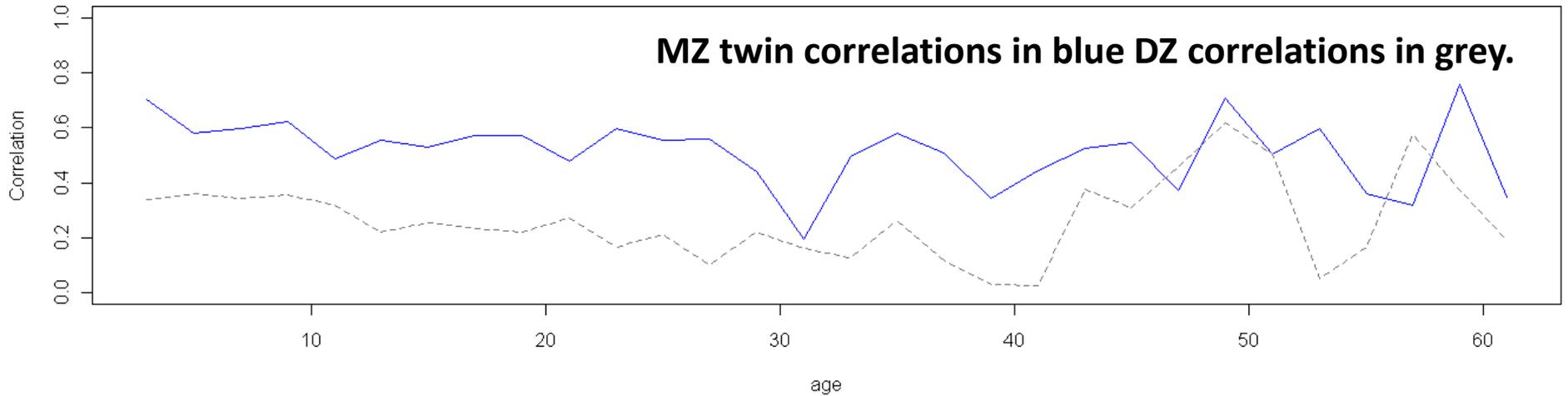
Cells in the matrix with Anx/dep observations are in Blue, darker indicates more data

# Anx/Dep: Mean *self* ratings and individual trajectories per subject over age

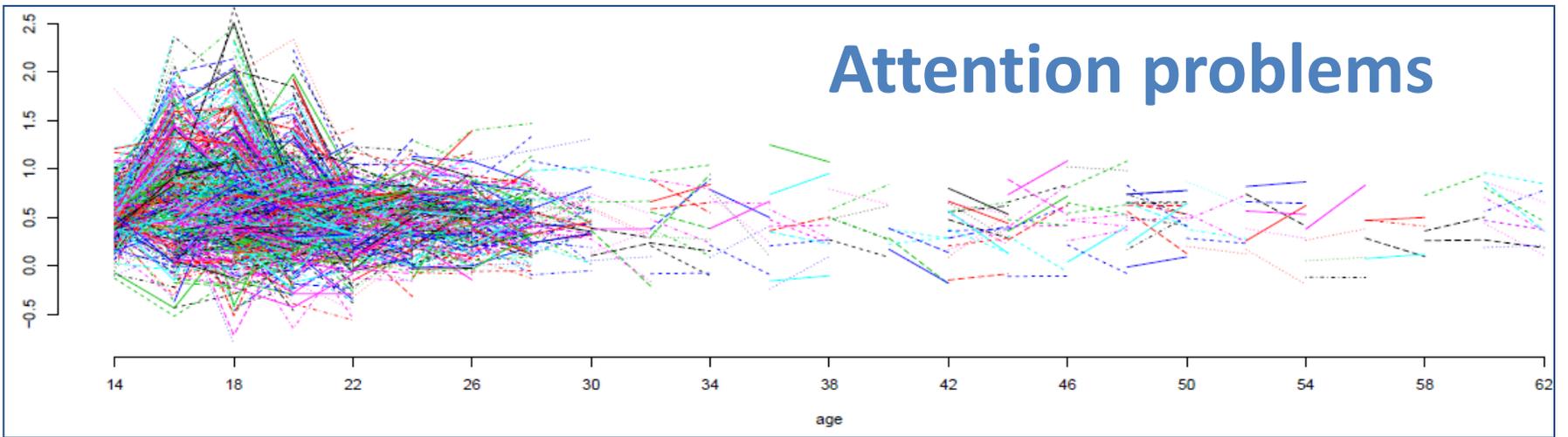


Males: blue against grey (women) background.  
Females: red against grey (men) background.

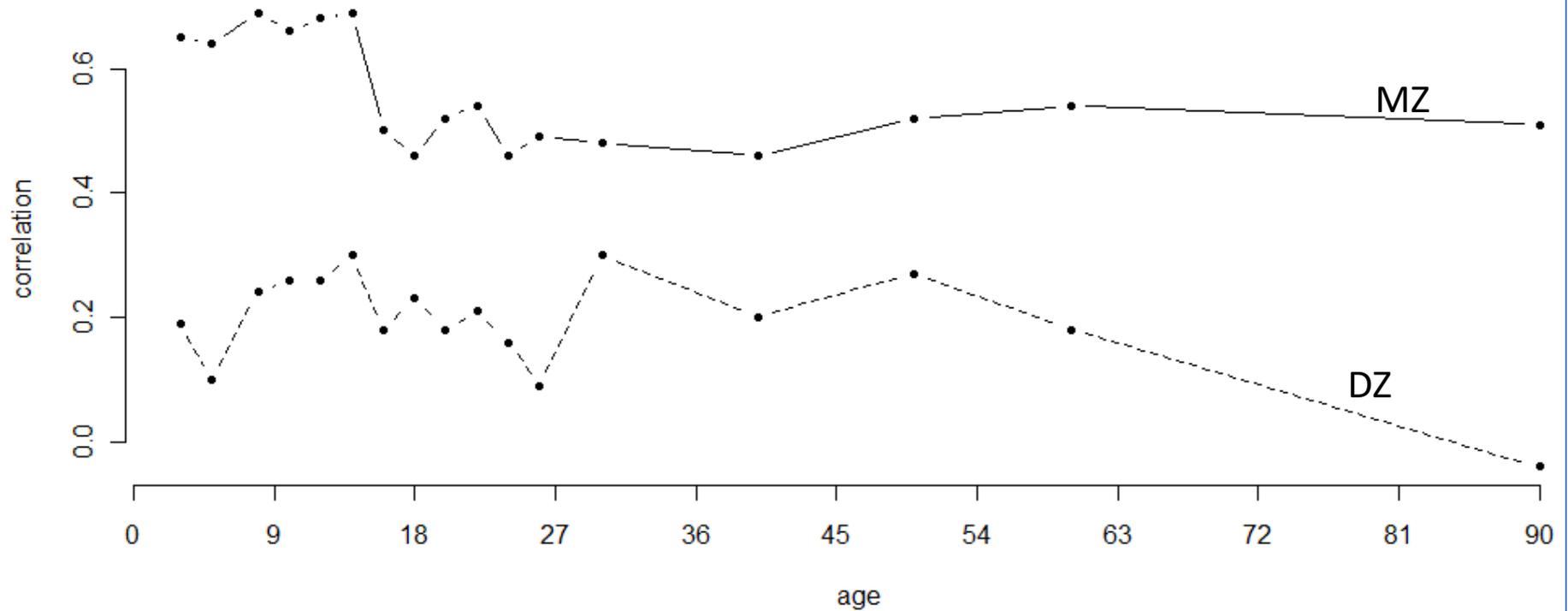
# Anxious depression: Twin correlations for MZ and DZ twin pairs across age



# Attention problems



## twin correlations



# Attention problems

Age	3-5	5	6-8	10	12	14	16	18	20	22	24	26	30	40	50	60	90
$h^2$	66	66	83	86	75	75	48	52	57	58	52	50	59	47	59	59	52
$h^2_{\text{new}}$	-	35	52	00	16	01	26	10	01	02	00	00	00	00	00	00	00
$h^2_{\text{stable}}$	-	31	31	86	59	74	22	42	56	56	52	50	59	47	59	59	52

**Total** heritability as a function of age (blue shades)

Heritability that is innovation (**new genetic variance**)

Heritability that is shared across age (**stable genetic variance**)

**After adolescence no genetic innovation, the variation in Attention problems is still mainly explained by Genes**

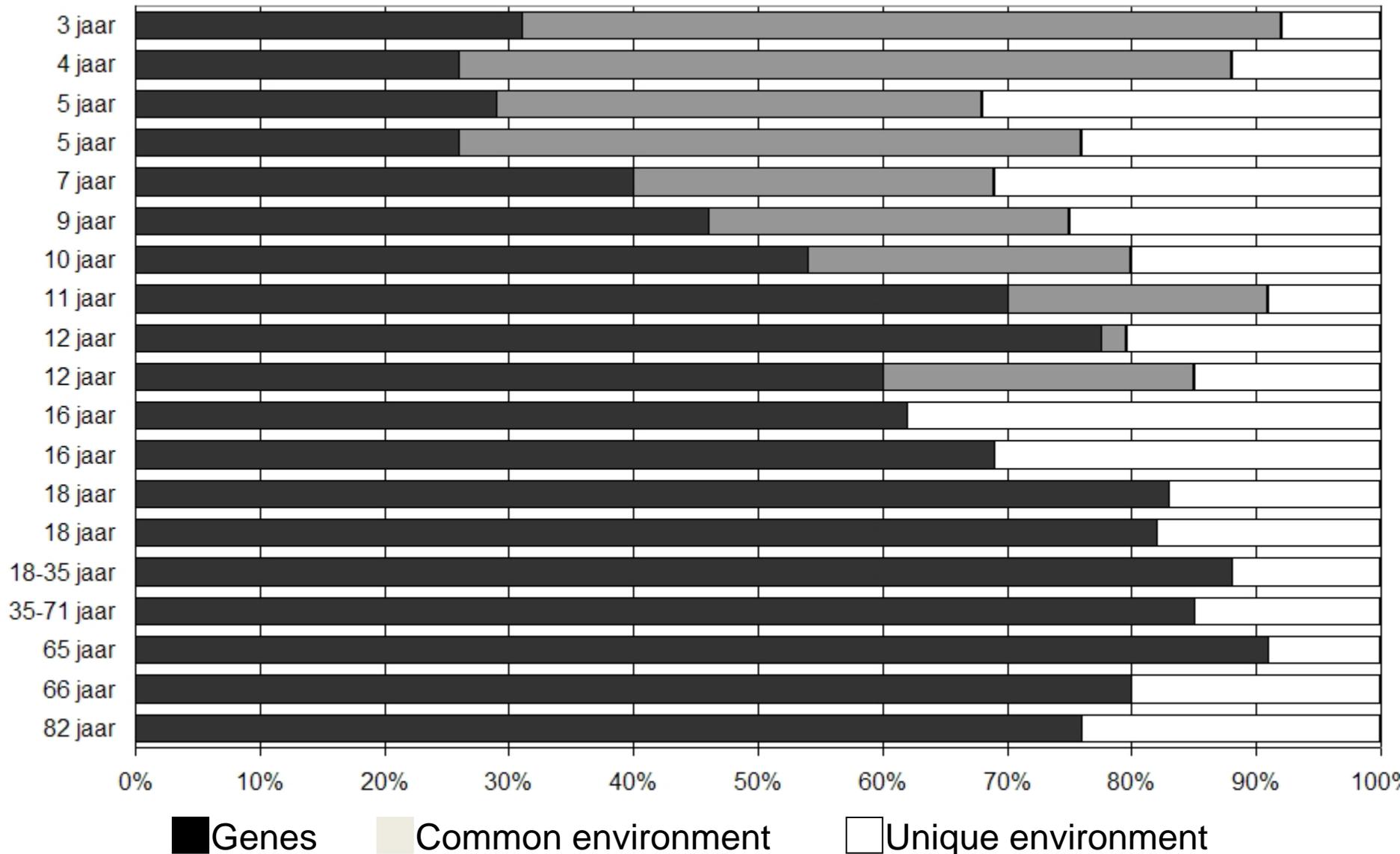
## In conclusion

Very little / no evidence for genotype x age interaction for depression or ADHD / AP

Very little evidence for genetic innovation between ages 18 and 60+: no new genes expressed

Cognition, genetics, lipids, ageing

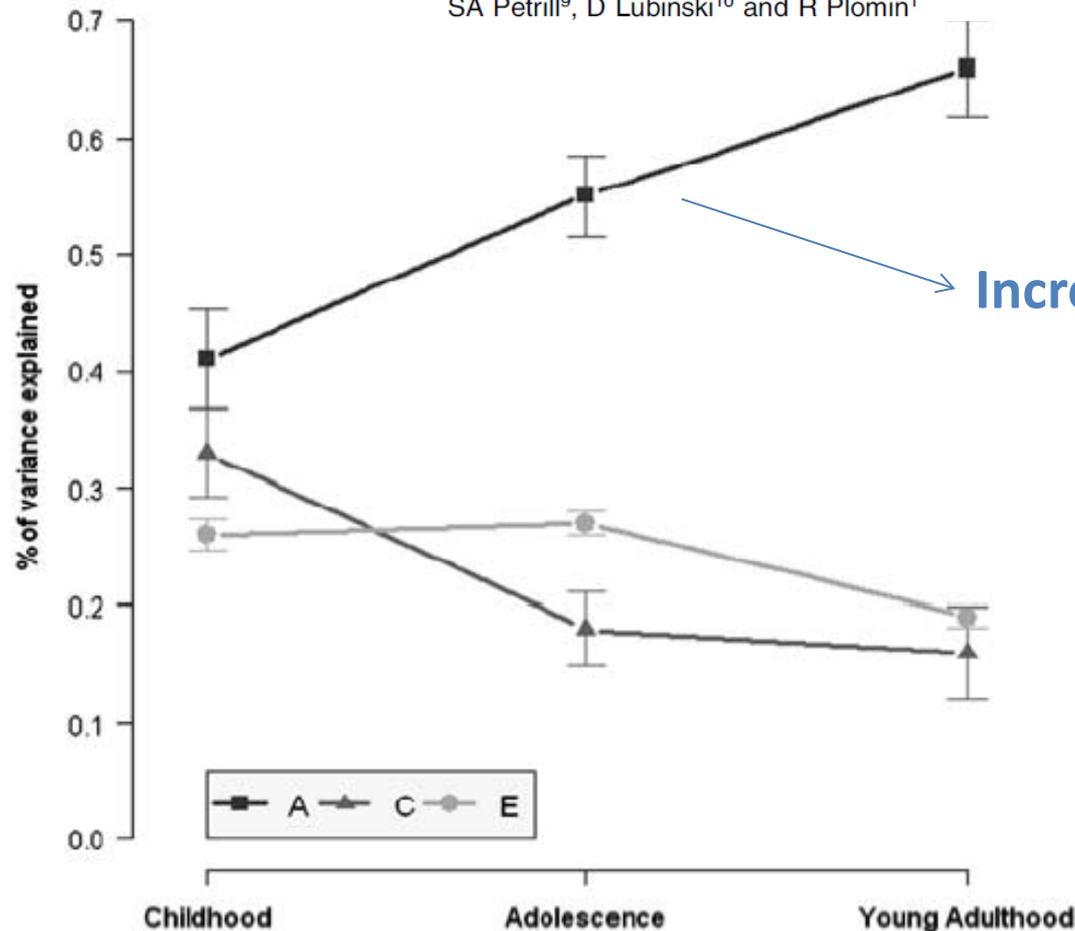
# IQ heritability (low at early ages)



## ORIGINAL ARTICLE

# The heritability of general cognitive ability increases linearly from childhood to young adulthood

CMA Haworth<sup>1</sup>, MJ Wright<sup>2</sup>, M Luciano<sup>2</sup>, NG Martin<sup>2</sup>, EJC de Geus<sup>3</sup>, CEM van Beijsterveldt<sup>3</sup>, M Bartels<sup>3</sup>, D Posthuma<sup>3,4,5</sup>, DI Boomsma<sup>3</sup>, OSP Davis<sup>1</sup>, Y Kovas<sup>1</sup>, RP Corley<sup>6</sup>, JC DeFries<sup>6</sup>, JK Hewitt<sup>6</sup>, RK Olson<sup>6</sup>, S-A Rhea<sup>6</sup>, SJ Wadsworth<sup>6</sup>, WG Iacono<sup>7</sup>, M McGue<sup>7</sup>, LA Thompson<sup>8</sup>, SA Hart<sup>9</sup>, SA Petrill<sup>9</sup>, D Lubinski<sup>10</sup> and R Plomin<sup>1</sup>



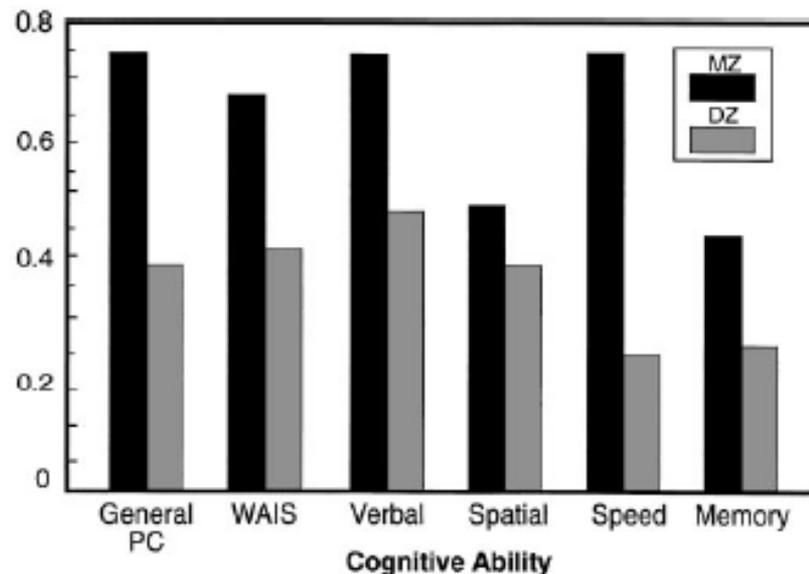
→ Increase in heritability

This is observed across all studies: Three US studies: Minnesota, Ohio, Colorado. One from Australia. Two from EU: Netherlands, UK. Age ranged from 6 to 71 years

# Substantial Genetic Influence on Cognitive Abilities in Twins 80 or More Years Old

Gerald E. McClearn, Boo Johansson, Stig Berg,  
Nancy L. Pedersen, Frank Ahern, Stephen A. Petrill,  
Robert Plomin\*

**Fig. 2.** Intraclass correlations for identical twins (MZ; black bars) and fraternal twins (DZ; gray bars) for general cognitive ability (PC and WAIS) and specific cognitive abilities.



Heritability of lipids in different age groups from 3 countries

# Heritabilities of Apolipoprotein and Lipid Levels in Three Countries

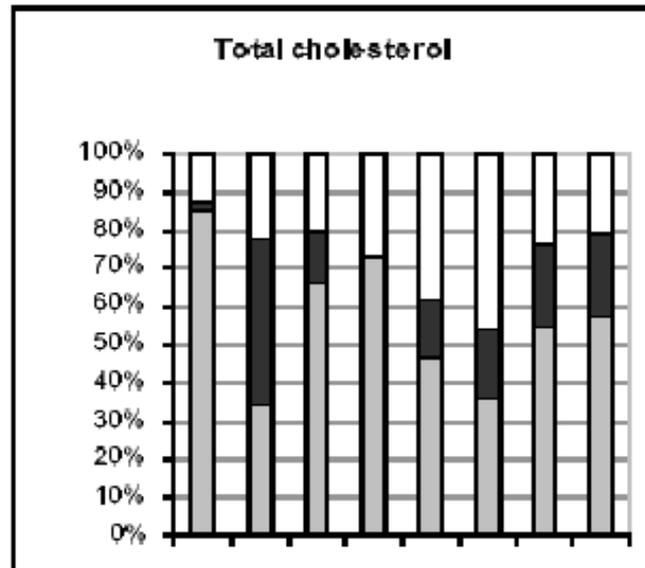
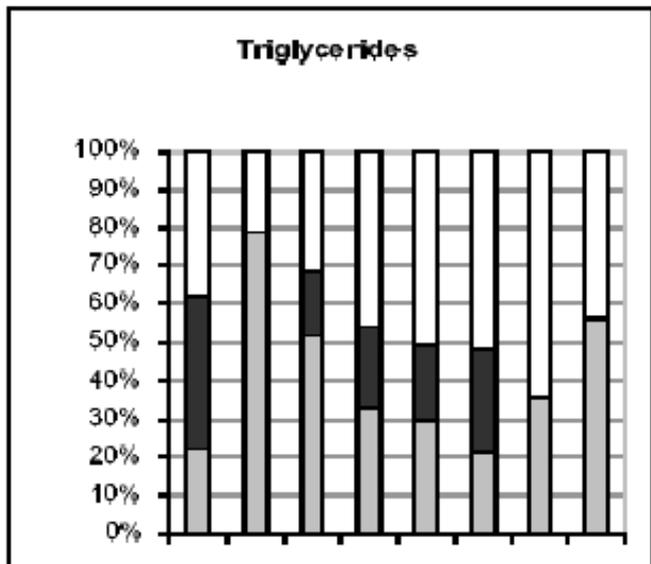
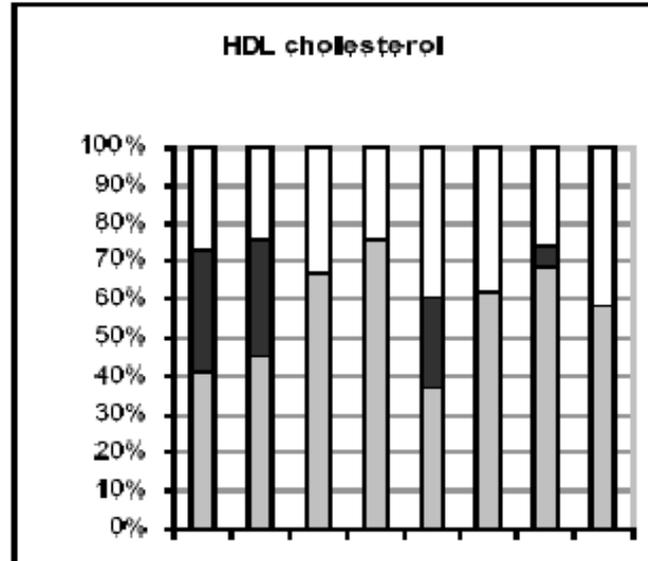
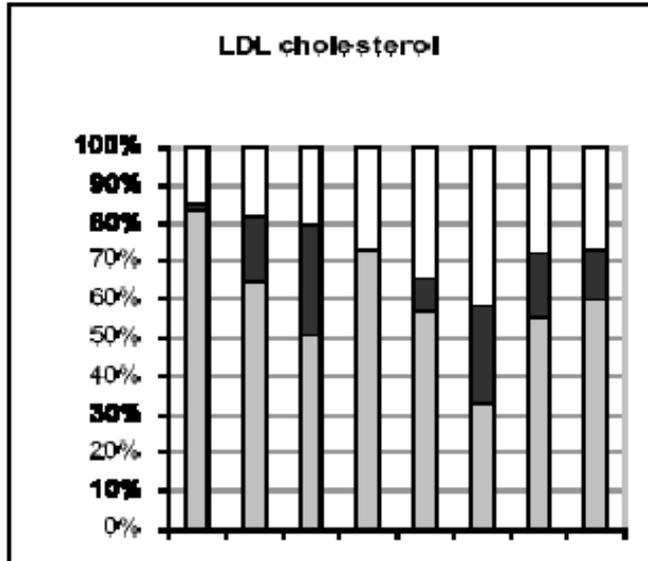
Marian Beekman<sup>1,2</sup>, Bastiaan T. Heijmans<sup>1</sup>, Nicholas G. Martin<sup>3</sup>, Nancy L. Pedersen<sup>4</sup>, John B. Whitfield<sup>5</sup>, Ulf DeFaire<sup>6</sup>, G. Caroline M. van Baal<sup>7</sup>, Harold Snieder<sup>8,9</sup>, George P. Vogler<sup>10</sup>, P. Eline Slagboom<sup>1</sup>, and Dorret I. Boomsma<sup>7</sup>

**Table 1**

Descriptives of the Twin Samples, Means (and Standard Deviations) for Each Sample by Sex, for Levels of Apolipoprotein E, All, AI and B and for Levels of Total, Low-density-lipoprotein, High-density-lipoprotein Cholesterol and the Natural Log of Triglyceride Levels

Twin sample	Young Dutch twins		Middle-aged Dutch twins		Australian twins		Swedish twins	
	Men	Women	Men	Women	Men	Women	Men	Women
Mean (SD)								
Number of individuals	161	159	192	218	874	1850	234	350
Age (yr)	16.77 (1.78)	16.71 (2.20)	43.55 (6.47)	44.70 (6.79)	44.10 (10.41)	45.88 (11.69)	65.02 (7.51)	66.09 (8.99)

# Heritability (gray bars) for LDL, HDL, triglycerides, total cholesterol



Young Dutch / middle-age Dutch / Australian, Old Swedish twins: M-F within cohort

## Serum Lipid Levels and Cognitive Change in Late Life

Chandra A. Reynolds, PhD,\* Margaret Gatz, PhD,<sup>†‡</sup> Jonathan A. Prince, PhD,<sup>‡</sup> Stig Berg, PhD,<sup>§</sup> and Nancy L. Pedersen, PhD<sup>†‡</sup>

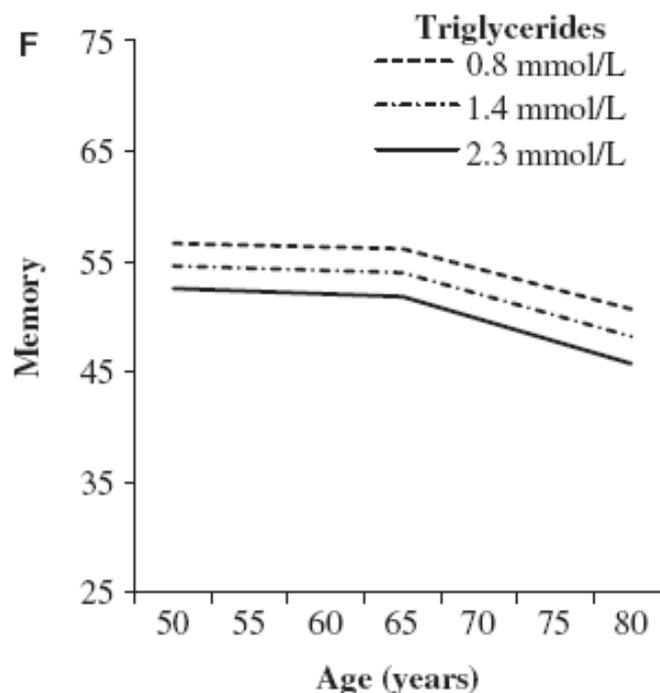
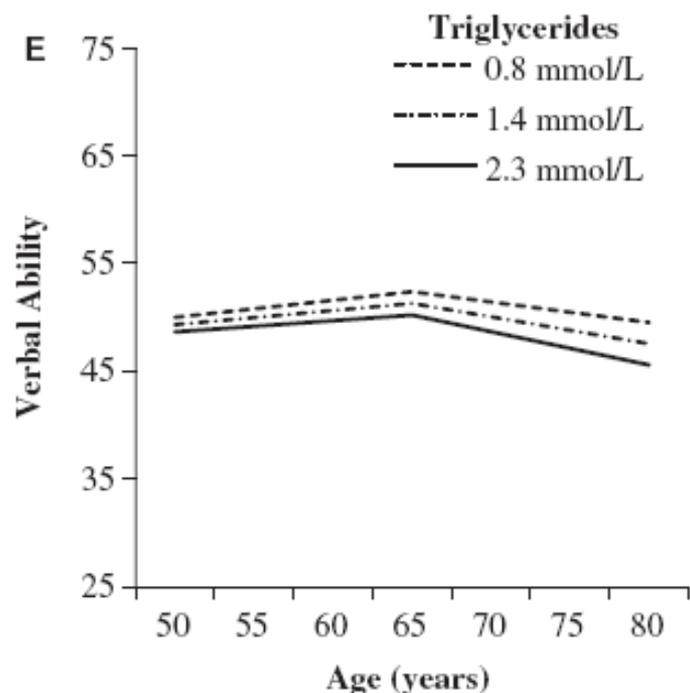


Table 3. Paired *T*-Test Analyses of Lipid Values for Twin Pairs Discordant for Dementia

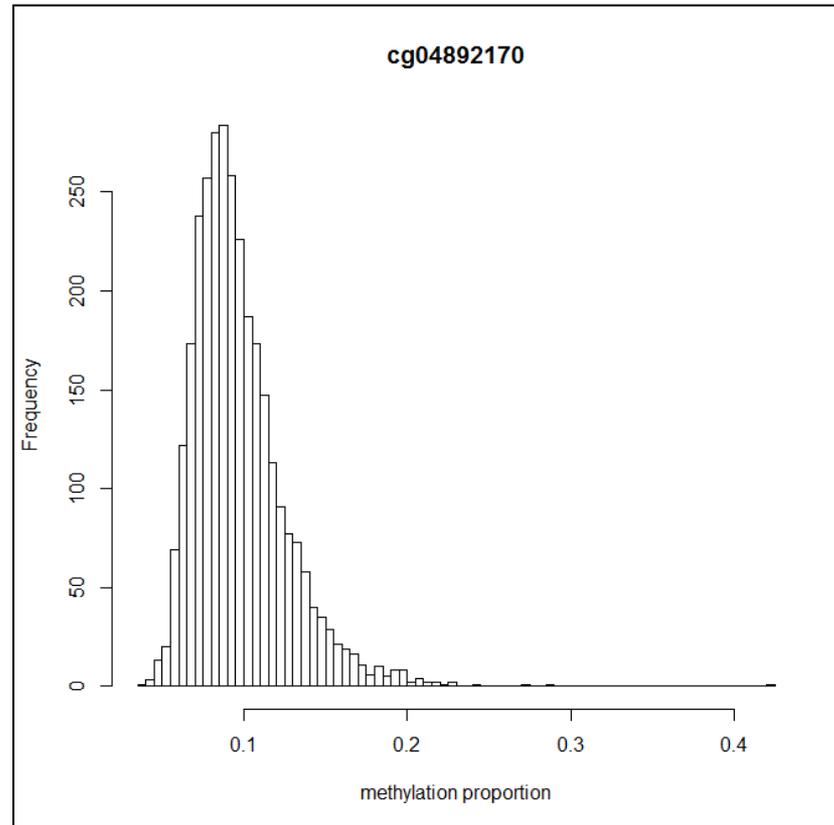
Variable	Pairs, n	Mean Difference Untransformed	Mean Difference Log Transformed	<i>T</i>	<i>P</i> -Value
High-density lipoprotein cholesterol (HDL-C)	17	0.024	0.009	0.176	.86
ApoA1	21	0.030	—	0.566	.58
ApoB	21	0.103	0.078	2.362	.03
ApoB/ApoA1	21	0.069	0.069	1.692	.11
Triglycerides	21	0.067	0.017	0.164	.87
Total cholesterol	21	0.395	—	2.363	.03

*T*-tests for differences between log transformed variables shown where transformation applied. The lipid values for the unaffected twin were subtracted from their affected co-twin, with positive differences indicating higher lipid values associated with dementia status.

Apo = apolipoprotein; log = natural log of values.

**The study included twin pairs discordant for dementia later in life: The twin who remained healthy had lower apoB and cholesterol levels early on.**

**Epigenetics: DNA methylation level at one locus in a population of cells (e.g. whole blood) is a **quantitative trait****



**What are the total effects of genetic and environmental factors?**

- Do these effects depend on age or sex?
- Do these effects vary between different genomic regions?

ARTICLE

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OPEN

# Genetic and environmental influences interact with age and sex in shaping the human methylome

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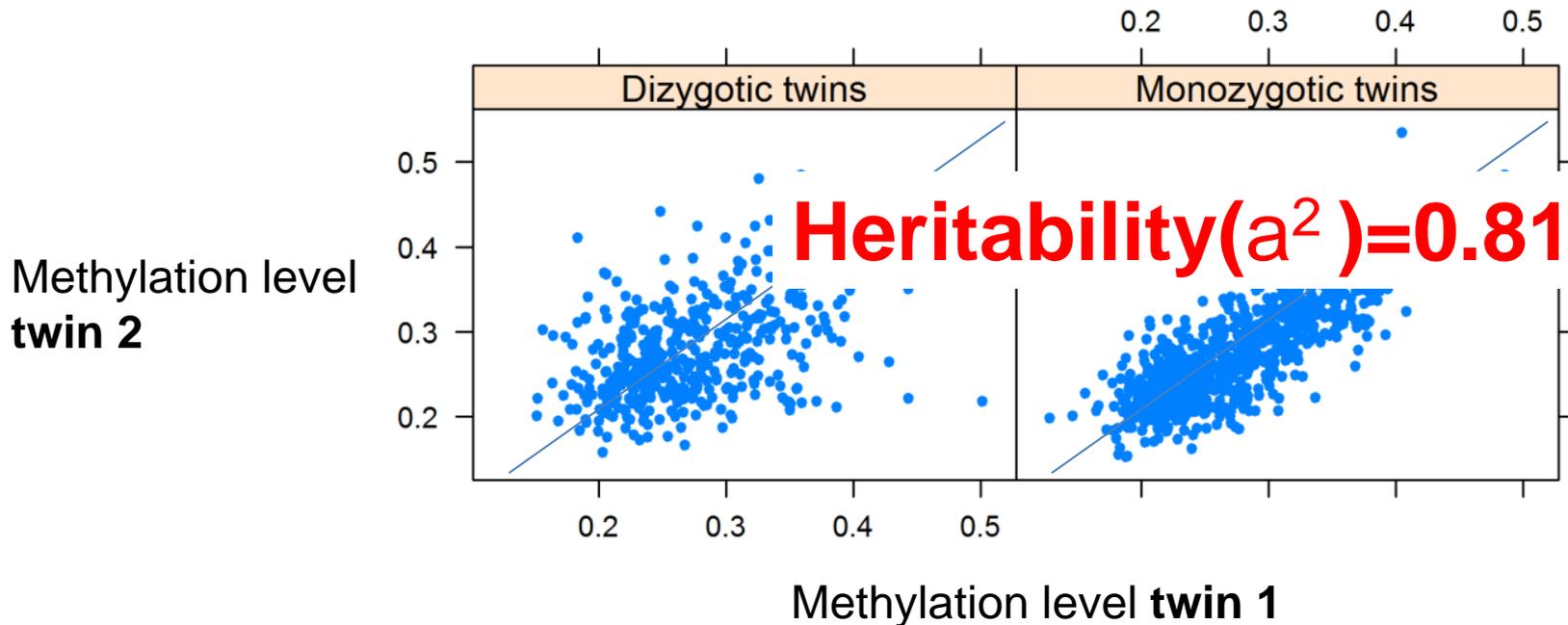
- We applied the classical twin model to DNA methylation levels to estimate components of variation and their interactions with age.
- We also estimated ‘SNP heritability’ and heritability due to other genetic effects.

# The classical twin design

Differences= VE (Unique environment, stochastic, measurement error)

Covariance (MZ)= **100%**  $V_A$  + **100%**  $V_D$  + **100%**  $V_C$

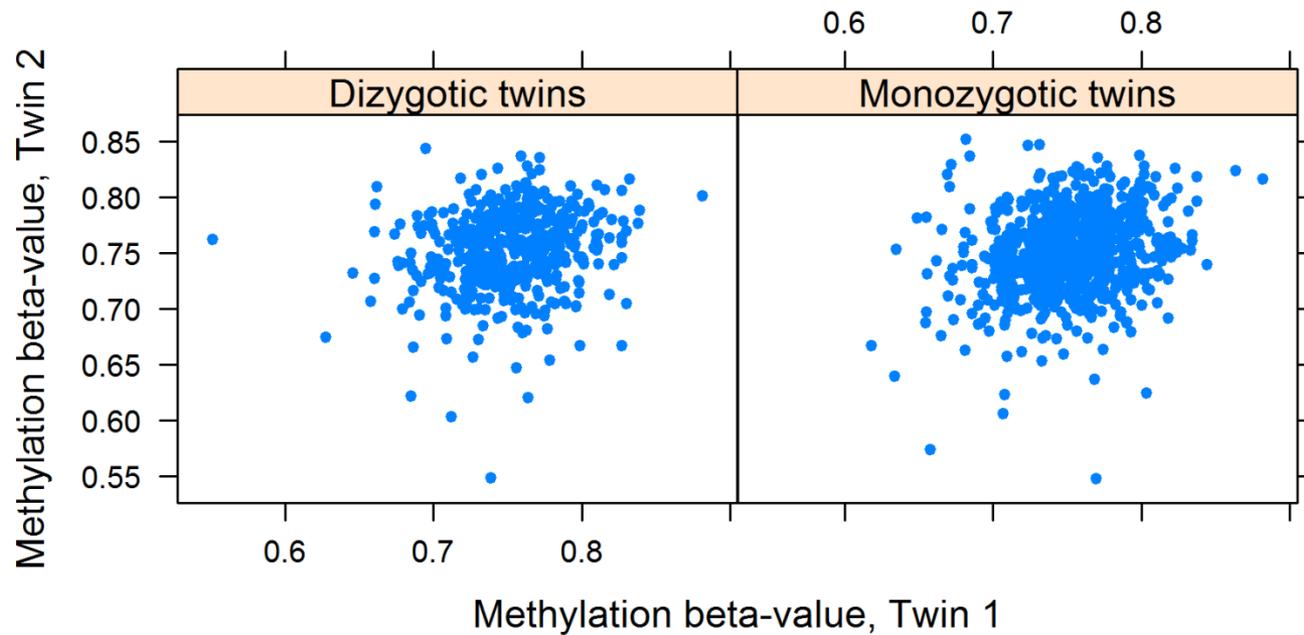
Covariance (DZ)= **50%**  $V_A$  + **25%**  $V_D$  + **100%**  $V_C$



$$\text{Heritability } (a^2) = \frac{\text{additive genetic variance } (V_A)}{\text{total variance}}$$

Example of a methylation site with a *low heritability*

**cg05793094**, Heritability ( $V_a/V_{total}$ )=0.18



# Partitioning the total heritability into 'SNP heritability' and other genetic effects

$$covar(CpGi) = \overbrace{GRM_{n*n}^{IBS} \otimes \sigma_{SNPs}^2}^{\text{SNPs}} + \overbrace{GRM_{n*n}^{IBS>0.05} \otimes (\sigma_{IBD}^2 - \sigma_{SNPs}^2)}^{\text{Other genetic effects}} + I_{n*n} \otimes \sigma_e^2$$

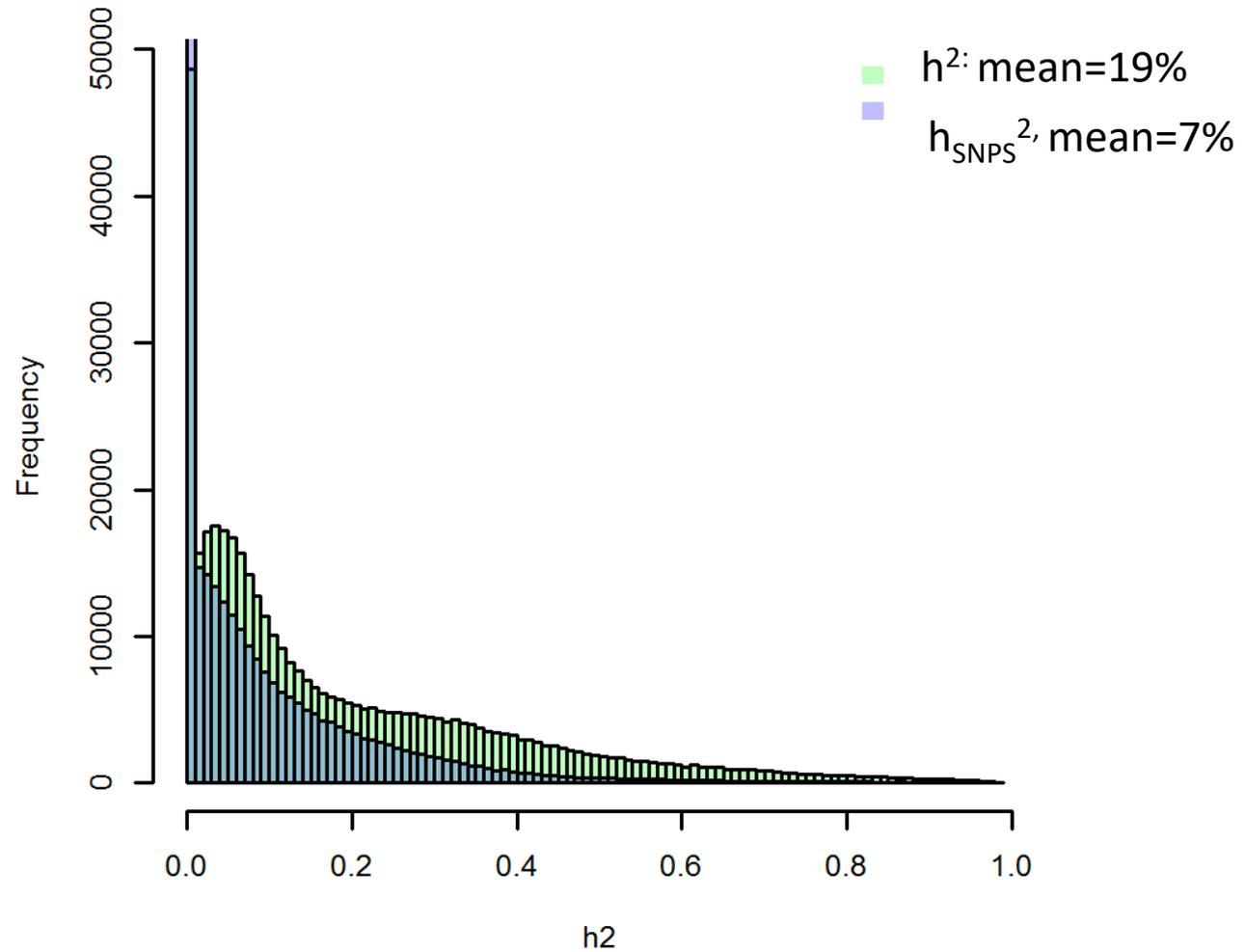
Additive genetic variance due to all SNPs
Genetic relatedness (IBD)
Additive genetic variance not explained by SNPs

e.g.
0 between unrelated individuals
0.5 between parent-offspring,
0.5 on average between DZ twins
1 between monozygotic (MZ) twins,

Covariance (methylation level) between individuals (matrix)

$GRM_{n*n}^{IBS}$ : Genetic relationship matrix (IBS) all individuals, from **G**  
 $GRM_{n*n}^{IBS>0.05}$ : Same matrix, but IBS set to zero for distant relatives

# Total and SNP heritability of DNA methylation level at 411,169 sites in the genome



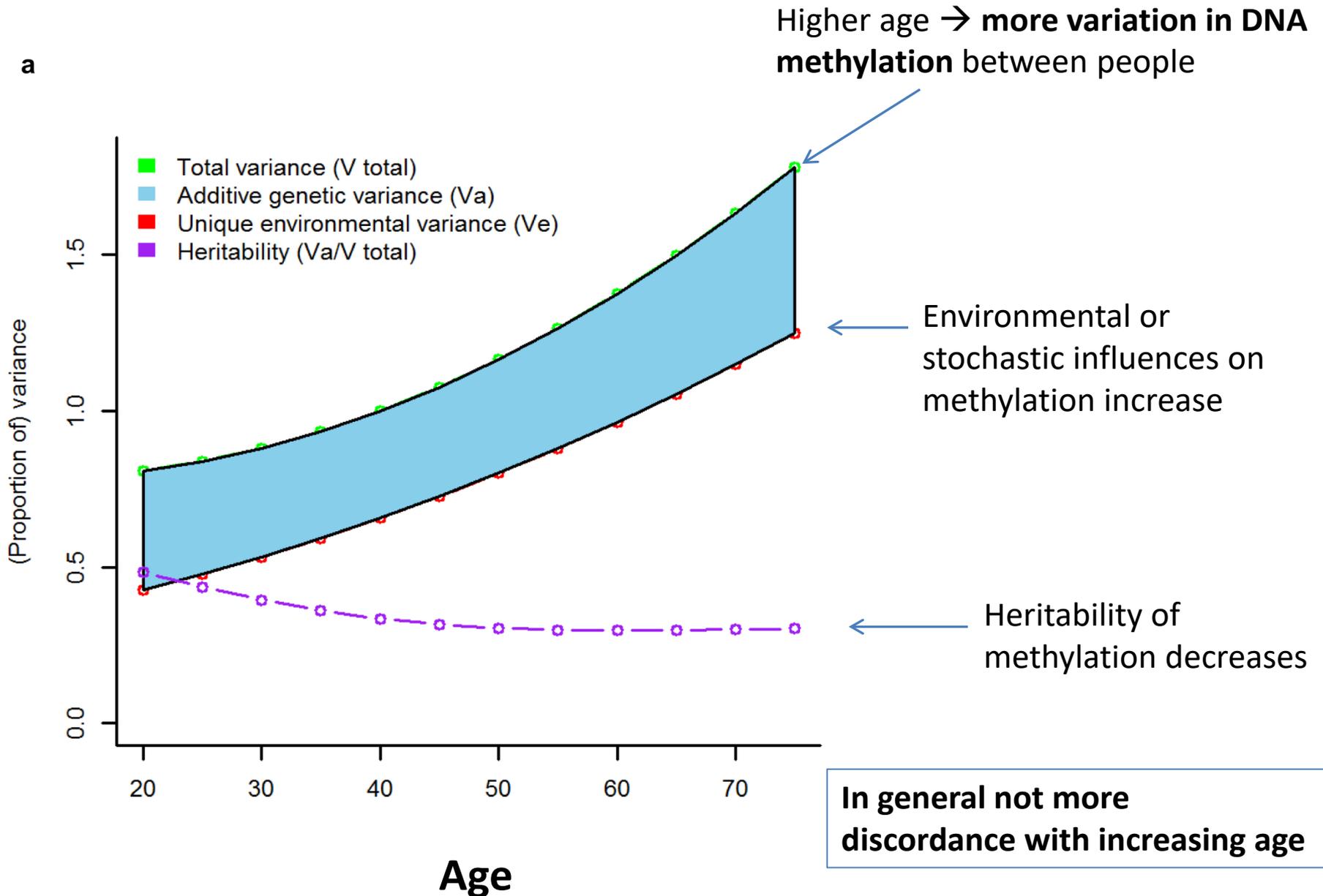
# Age

- 33% of methylation sites: significant change in **mean** methylation level with age
- 10% of methylation sites: significant change of the genetic or environmental **variance** with age

There is an age related shift in the causes of variation in DNA methylation between people

- At 39,455 methylation sites

a



Discordant for exposure

Discordant (MZ) twins

Discordant for phenotype

# Why Some Women Look Young for Their Age

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Younger looking

Older looking

Composite images of the effects of environment on variation in perceived age in MZ twins.

The older looking twin sister composite shows signs of **increased skin wrinkling, increased nasolabial fold shadowing and a grayer skin color, a thinner face and reduced lip fullness.**

Each composite was derived from 14 twin images, chronological age was 67 [60–76] for the composites.

## Discordant Monozygotic Twins

- Different chromosome constitutions because of post-zygotic non-disjunction: e.g. MZ male-female 46,XY - 45,XO
- Differences in DNA sequence
- Differential *methylation* (imprinted genes)
- CNV (copy number variation)
- Skewed X chromosome inactivation in female MZ twins
- Differential trinucleotide repeat expansion
- Post-zygotic mutation
- *Prenatal* differences
- *Postnatal* environmental differences

# Aging as Accelerated Accumulation of Somatic Variants: Whole-Genome Sequencing of Centenarian and Middle-Aged Monozygotic Twin Pairs

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Kai Ye,<sup>1</sup> Marian Beekman,<sup>1,2</sup> Eric-Wubbo Lameijer,<sup>1</sup> Yanju Zhang,<sup>1</sup> Matthijs H. Moed,<sup>1</sup> Erik B. van den Akker,<sup>1,3</sup> Joris Deelen,<sup>1,2</sup> Jeanine J. Houwing-Duistermaat,<sup>4</sup> Dennis Kremer,<sup>1</sup> Seyed Yahya Anvar,<sup>5</sup> Jeroen F. J. Laros,<sup>5</sup> David Jones,<sup>6</sup> Keiran Raine,<sup>6</sup> Ben Blackburne,<sup>7</sup> Shobha Potluri,<sup>8</sup> Quan Long,<sup>9</sup> Victor Guryev,<sup>10</sup> Ruud van der Breggen,<sup>1</sup> Rudi G. J. Westendorp,<sup>11</sup> Peter A. C. 't Hoen,<sup>12</sup> Johan den Dunnen,<sup>12</sup> Gert Jan B. van Ommen,<sup>12</sup> Gonneke Willemsen,<sup>13</sup> Steven J. Pitts,<sup>8</sup> David R. Cox,<sup>8</sup> Zemin Ning,<sup>6</sup> Dorret I. Boomsma,<sup>13,\*</sup> and P. Eline Slagboom<sup>1,2,\*</sup>

Eight single base substitutions between co-twins were supported by two platforms and validated as somatic variants.

The number of somatic variants may be substantially larger but those present in smaller fractions of cells go undetected. Consistent, detectable somatic variation likely includes somatic mosaicism in blood generated during development or clonal expansion of mutations generated at any point during the lifetime. The frequency of these variants is limited in blood even after 100 years of life.

**This study showed that the number of detectable somatic variants in blood by NGS is very low and that accumulation of somatic mutations is not necessarily a consequence of a century of life.**

## Discordant MZ twin design

MZ concordance



**for complex disease (heritability) and  
MZ and DZ twin concordance**

	Probandwise concordance (%)	
	MZ	DZ
Diabetes Type 1 (88%)	<b>42.9</b>	7.4
Diabetes Type 2 (64%)	<b>34</b>	16
Multiple Sclerosis (25-70%)	<b>25.3</b>	5.4
Alzheimer's Disease (48%)	<b>32.2</b>	8.7
Parkinson Disease (34%)	<b>15.5</b>	11.1
Schizophrenia (81%)	<b>40.8</b>	5.3
Major Depression (37%)	<b>31.1</b>	25.1



## Two sides of the coin

***Personalized medicine?***  
Incomplete concordance  
of MZ twins indicates  
that a genome cannot  
predict individual  
outcome.

- Twin pairs a good way of recruiting **families**.
- Twins are **representative** of the population (no difference in mortality / (cancer) morbidity, many other traits too).
- Unique value of **MZ pairs** for e.g. epigenetics .
- Twin registers have (very long) **follow-up** / longitudinal data and/or biological samples; often **prospective**.
- Twins are usually phenotyped for **multiple traits**.
- Twin registers often have **environmental exposure** data.

[Parental Education and Genetics of BMI from Infancy to Old Age: A Pooled Analysis of 29 Twin Cohorts.](#)

Silventoinen

[Genetic and environmental influences on adult human height across birth cohorts from 1886 to 1994.](#)

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[Genetic and environmental stability in attention problems across the lifespan: evidence from the Netherlands twin register.](#) Kan KJ

[The Computerized Neurocognitive Battery: Validation, \*\*aging\*\* effects, and heritability across cognitive domains.](#)

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[Age-related accrual of methylomic variability is linked to fundamental \*\*ageing\*\* mechanisms.](#) Slieker RC

[Genetic and environmental influences interact with age and sex in shaping the human methylome.](#) van Dongen J

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