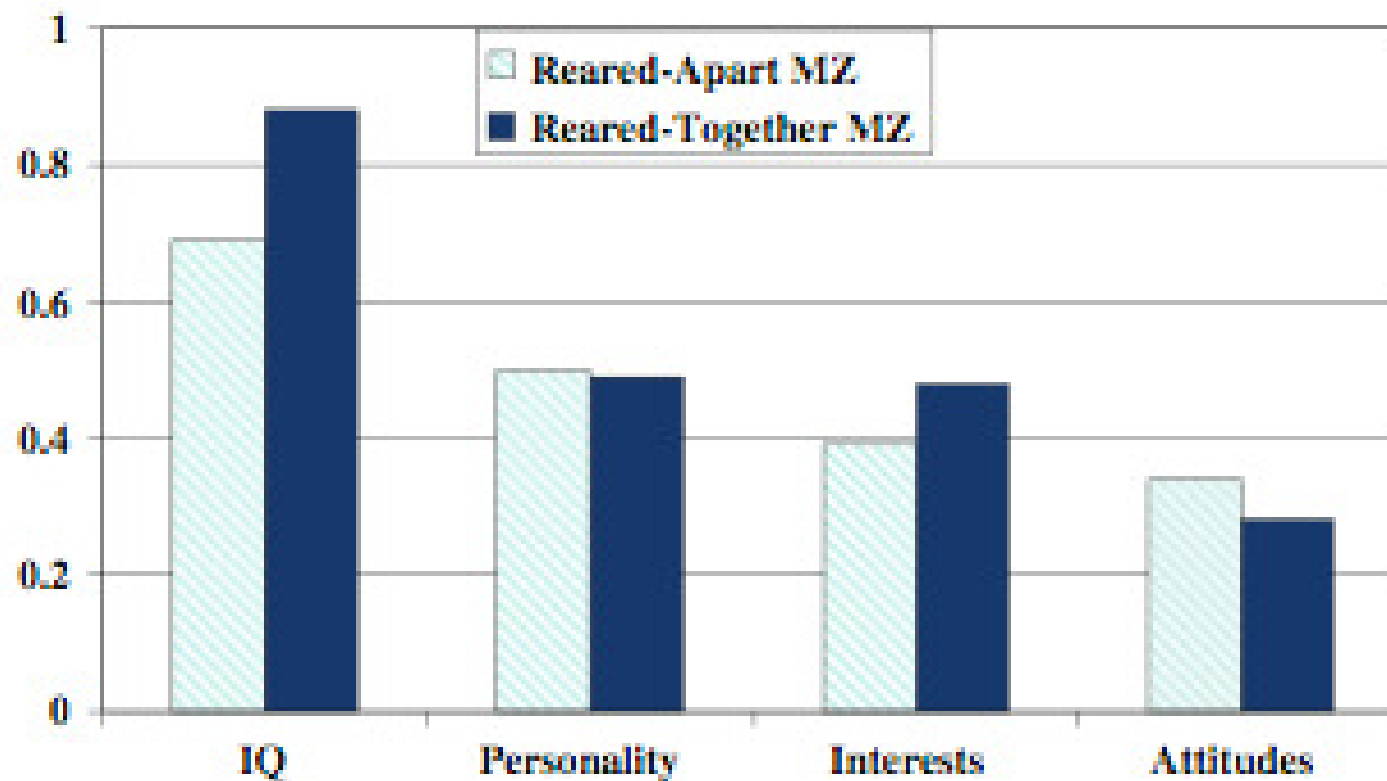


# Twins Studies

- Monozygotic (MZ; “identical”)
  - Fertilization of a single egg by a single sperm
  - Share 100% of their genetic material.
- Dizygotic (DZ, “fraternal” or “non-identical”)
  - Result from the independent fertilization of two eggs by two sperm
  - Share on average 50% of their genes (just like full siblings).

# A Natural Experiment

- Twins reared apart
  - They did not experience the same environment
  - Gives a much stronger test of genetic and non-shared environmental contributions
  - But separated MZs are rare



**Fig. 2** Average reared-apart and reared-together monozygotic (MZ) twin correlations in four domains of psychological functioning. Adapted from Bouchard et al. (1990)

# Variance Components

- Heritability (narrow-sense,  $A$  or  $a^2$ ; broad-sense,  $H$  or  $h^2$ ): phenotypic variance in a sample that can be attributed to genotypic variance.
- Shared or common environment ( $C$  or  $c^2$ ): experiences that makes individuals more similar to one another, regardless of genetic similarity
- Non-shared or Unique environment and Error ( $E$  or  $e^2$ ): What is left over

## **IDENTICAL TWINS**

- MONOZYGOTIC:
- Have IDENTICAL genes (A)
- Come from the same family (C)
- Have unique experiences during life (E)

## **FRATERNAL TWINS**

- DIZYGOTIC: Have DIFFERENT genes (A)
- Come from the same family (C)
- Have unique experiences during life (E)

# Falconer's model

Assumes all genetic effects are additive ( $h^2 = a^2$ )

$$r_{MZ} = a^2 + c^2$$

$$r_{DZ} = 0.5a^2 + c^2$$

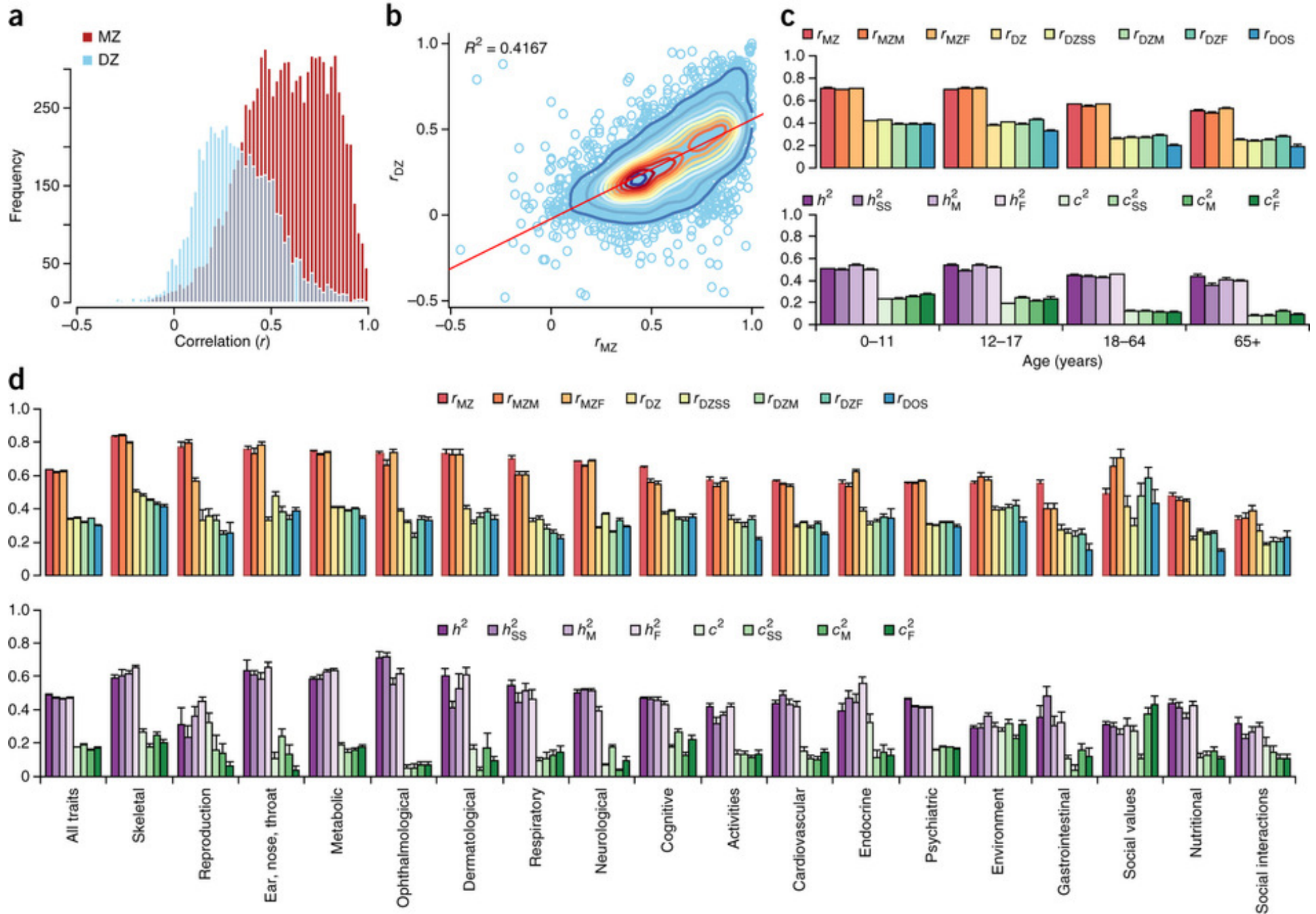
$$1.0 = a^2 + c^2 + e^2$$

# Falconer estimates

$$a^2 = 2(r_{MZ} - r_{DZ})$$

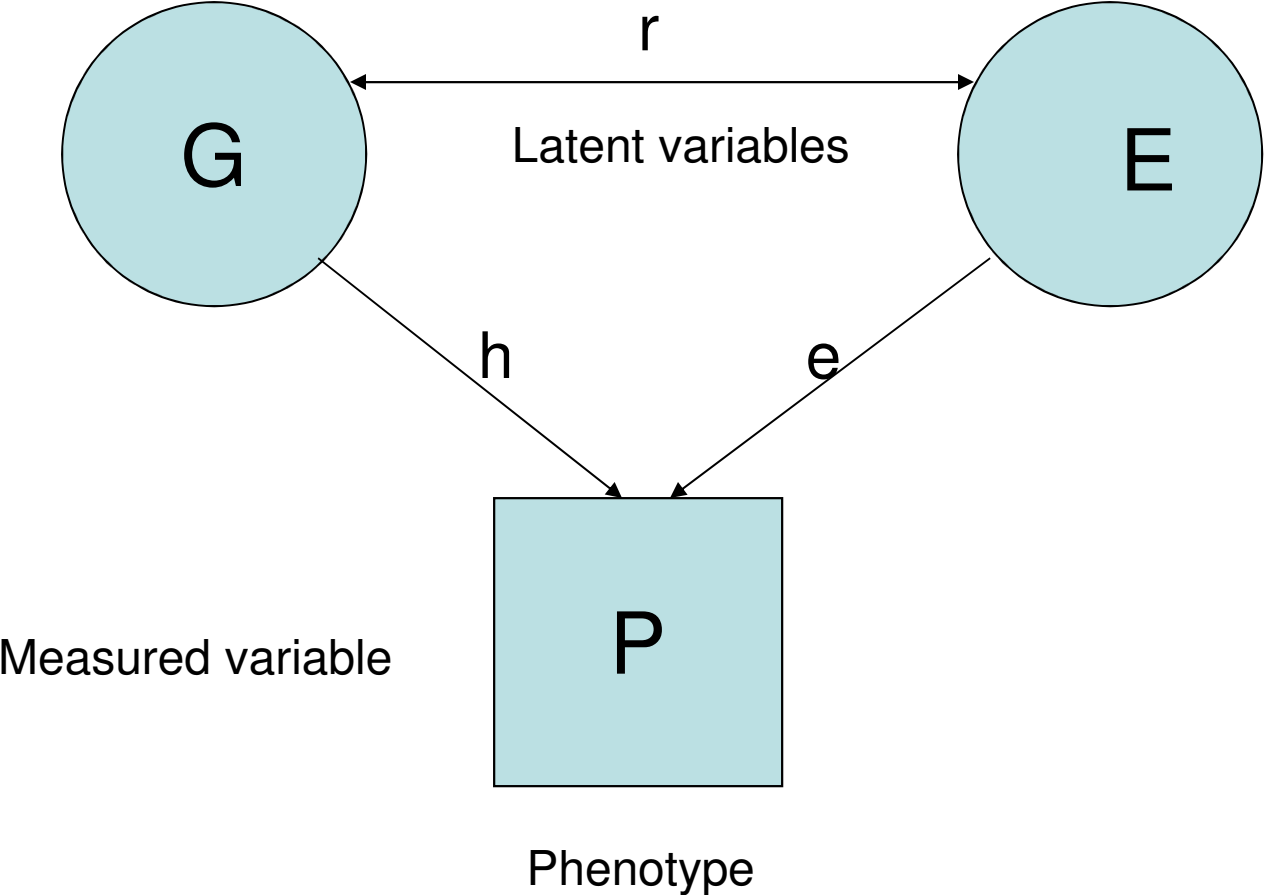
$$c^2 = 2r_{DZ} - r_{MZ}$$

$$e^2 = 1 - r_{MZ}$$





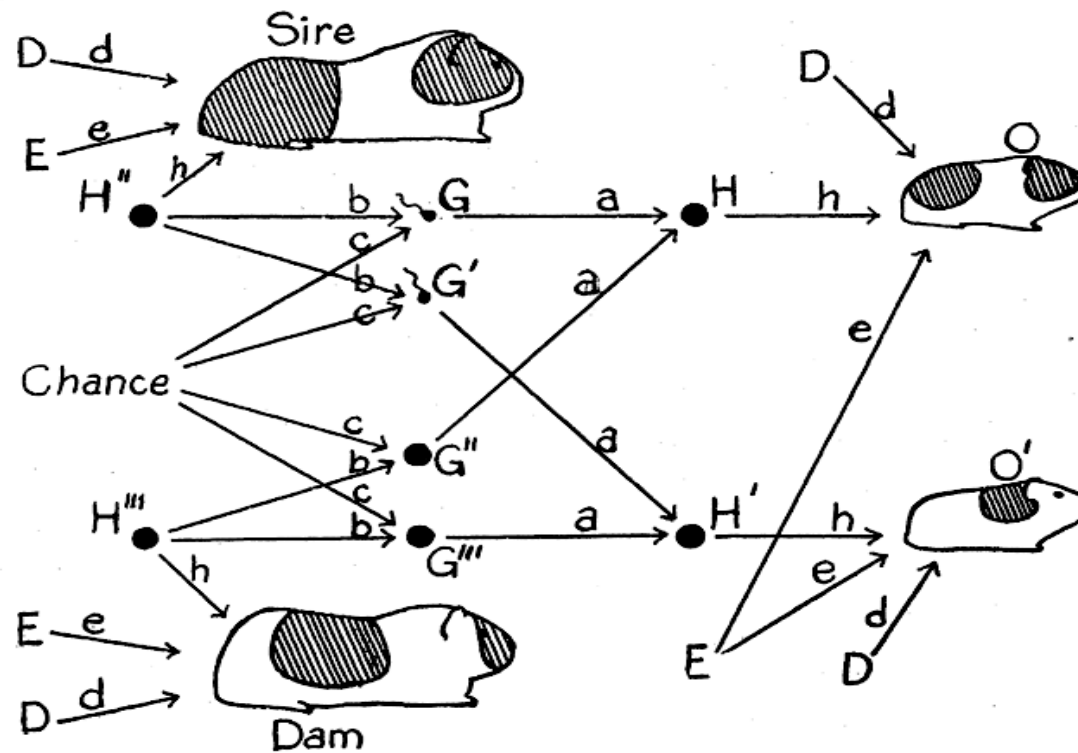
Path diagram for the effects of genes and environment on phenotype



# Path Analysis

- Derive predictions for the variances and covariances of the variables under the specified model
  - Present relationships between variables using **diagrams**
  - The relationships can also be represented as **structural equations** and **covariance matrices**
  - Structural equation modelling (SEM) represents a unified platform for path analytic and variance components models

# Path Diagram



# Maximum Likelihood Estimation

- Likelihood: probability that an observation (data point) is predicted by specified model
- For MLE, determine most likely values of population parameter value (e.g,  $\mu$ ,  $\sigma$ ,  $\beta$ ) given observed sample value
  - define model
  - define probability of observing a given event conditional on a particular set of parameters
  - choose a set of parameters which are most likely to have produced observed results

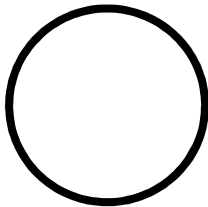
# Classical Twin Study Assumptions

- Equal means/variances in Twin 1 and Twin 2
- Equal means/variances in MZ and DZ twins
- Random Mating
- Equal Environments of MZ and DZ pairs
- No GE Correlation
- No G x E Interaction
- No Sex Limitation

# Path Diagram Conventions



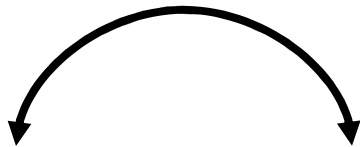
Observed Variable



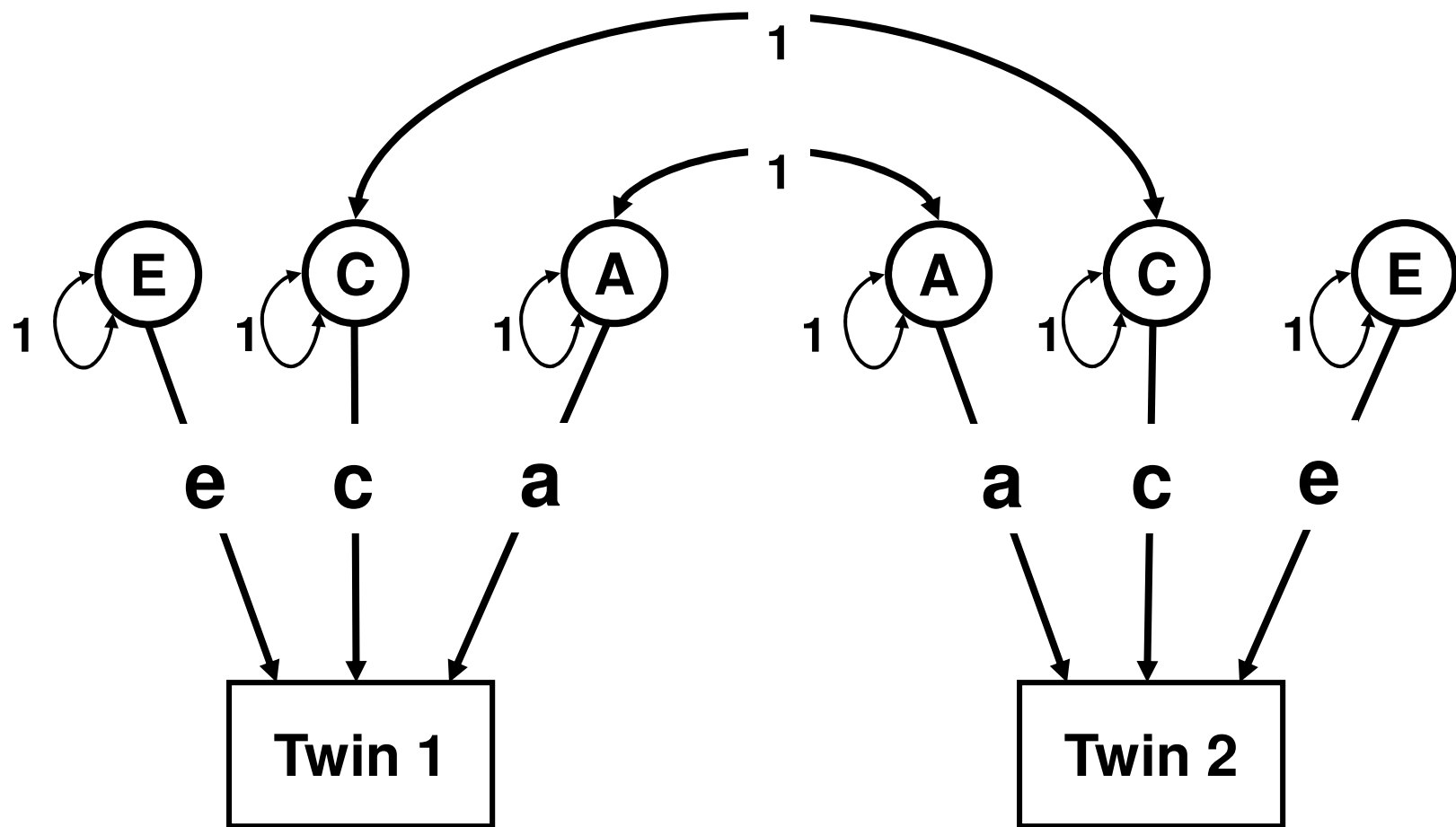
Latent Variable



Causal Path

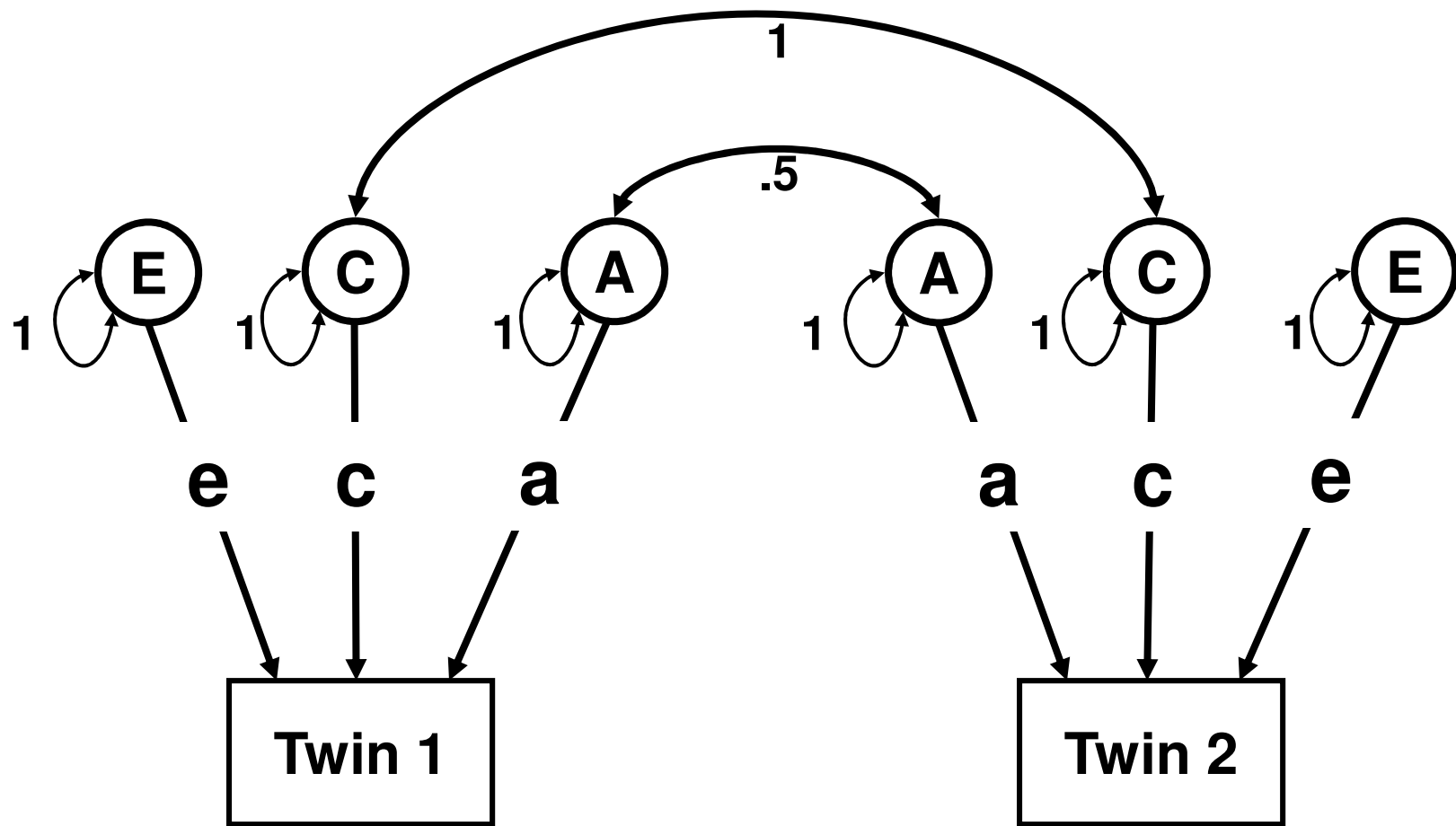


Covariance Path



## Model for an MZ PAIR

Note: a, c and e are the same cross twins



## Model for a DZ PAIR

Note: a, c and e are also the same cross groups



$$V_P = a^2 + c^2 + e^2$$

What about “dominance”\* effects?

$$V_P = a^2 + d^2 + c^2 + e^2$$

\* Dominance defined statistically as individuals being more similar on the basis of genetic overlap alone than would be predicted by a linear model – i.e., **any** non-linear genotype “dosage” effects

# Twin Correlations → Sources of Variance

$r_{MZ} > r_{DZ}$	A
$r_{MZ} = 2 r_{DZ}$	only A (no C,D)
$r_{MZ} = r_{DZ}$	only C (no A,D)
$r_{MZ} < 2 r_{DZ}$	A & C
$r_{MZ} > 2 r_{DZ}$	A & D

## ACE **or** ADE

$$\text{Cov(mz)} = a^2 + c^2 \quad \mathbf{or} \quad a^2 + d^2$$

$$\text{Cov(dz)} = \frac{1}{2} a^2 + c^2 \quad \mathbf{or} \quad \frac{1}{2} a^2 + \frac{1}{4} d^2$$

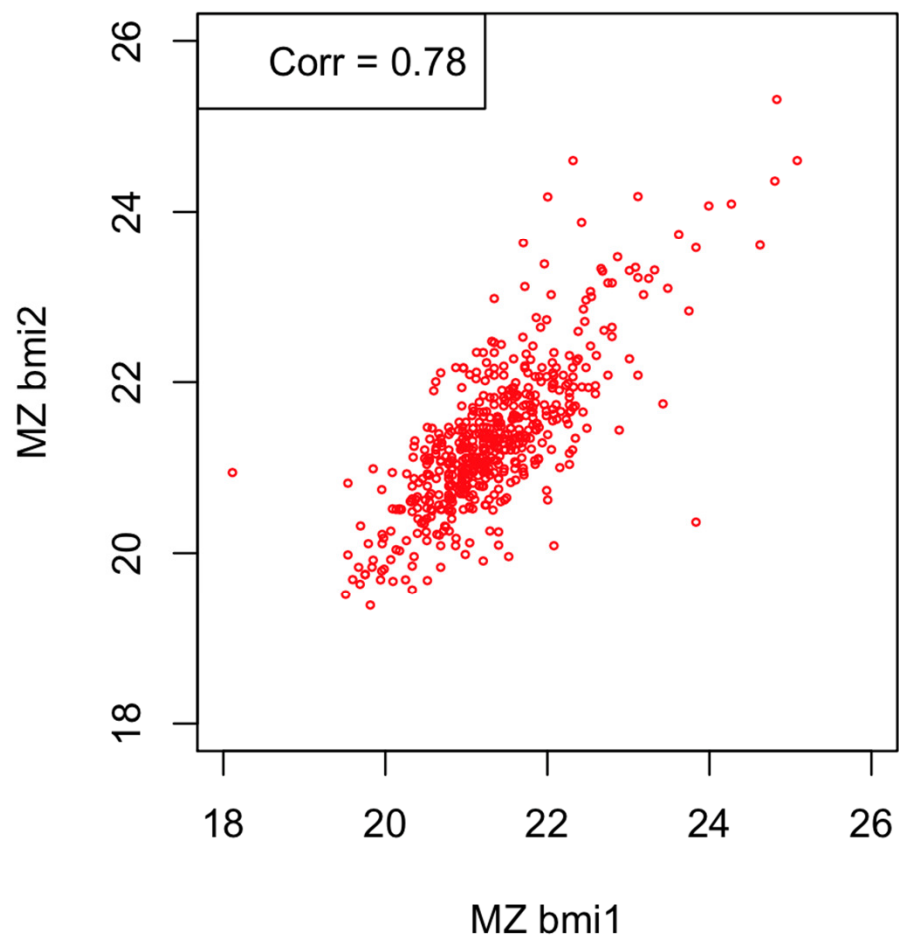
$$V_p = a^2 + c^2 + e^2 \quad \mathbf{or} \quad a^2 + d^2 + e^2$$

**3** unknown parameters (a, c, e or a, d, e),  
and only **3** distinctive predicted statistics:

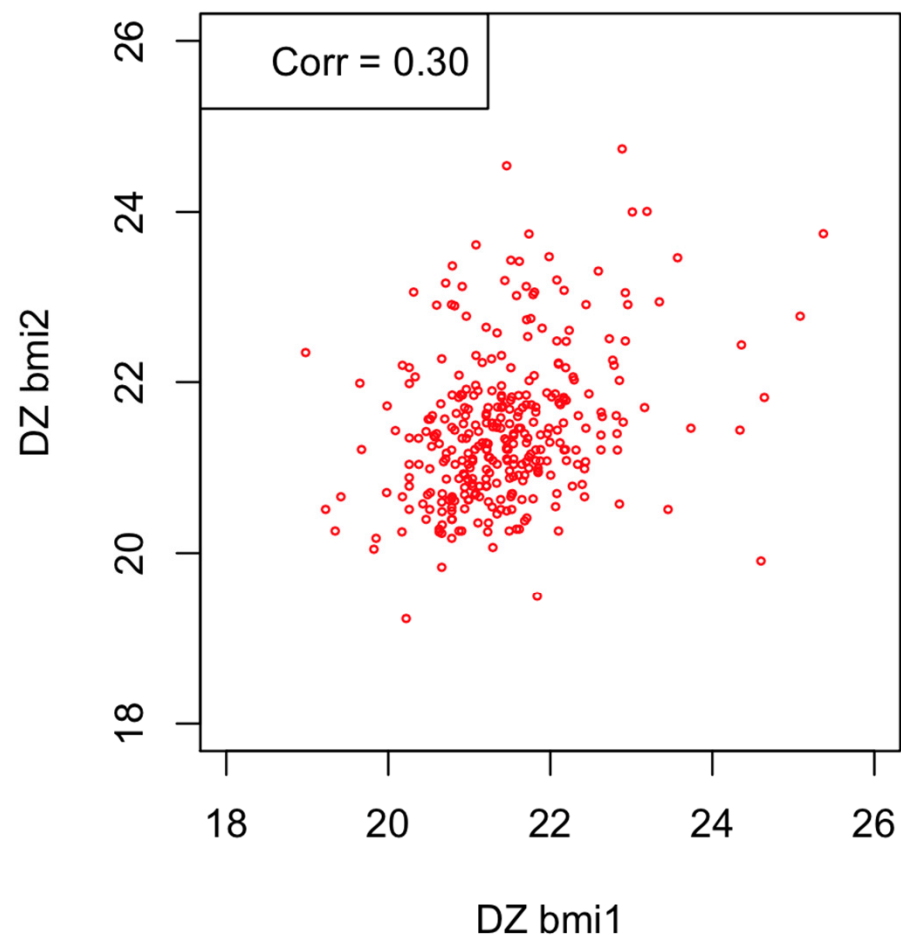
Cov MZ, Cov DZ,  $V_p$ )

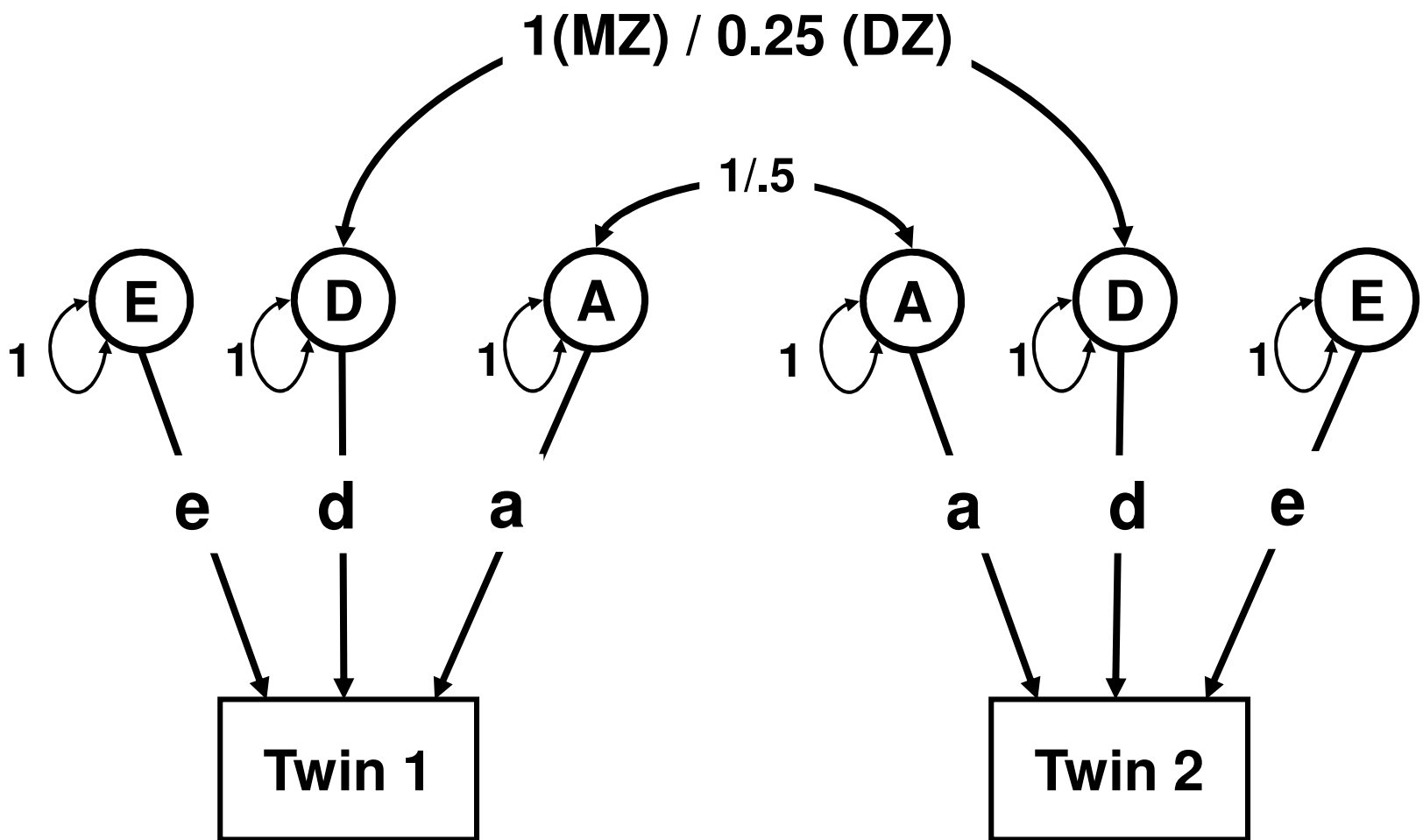
this model is **just identified**

**MZ BMI**



**DZ BMI**





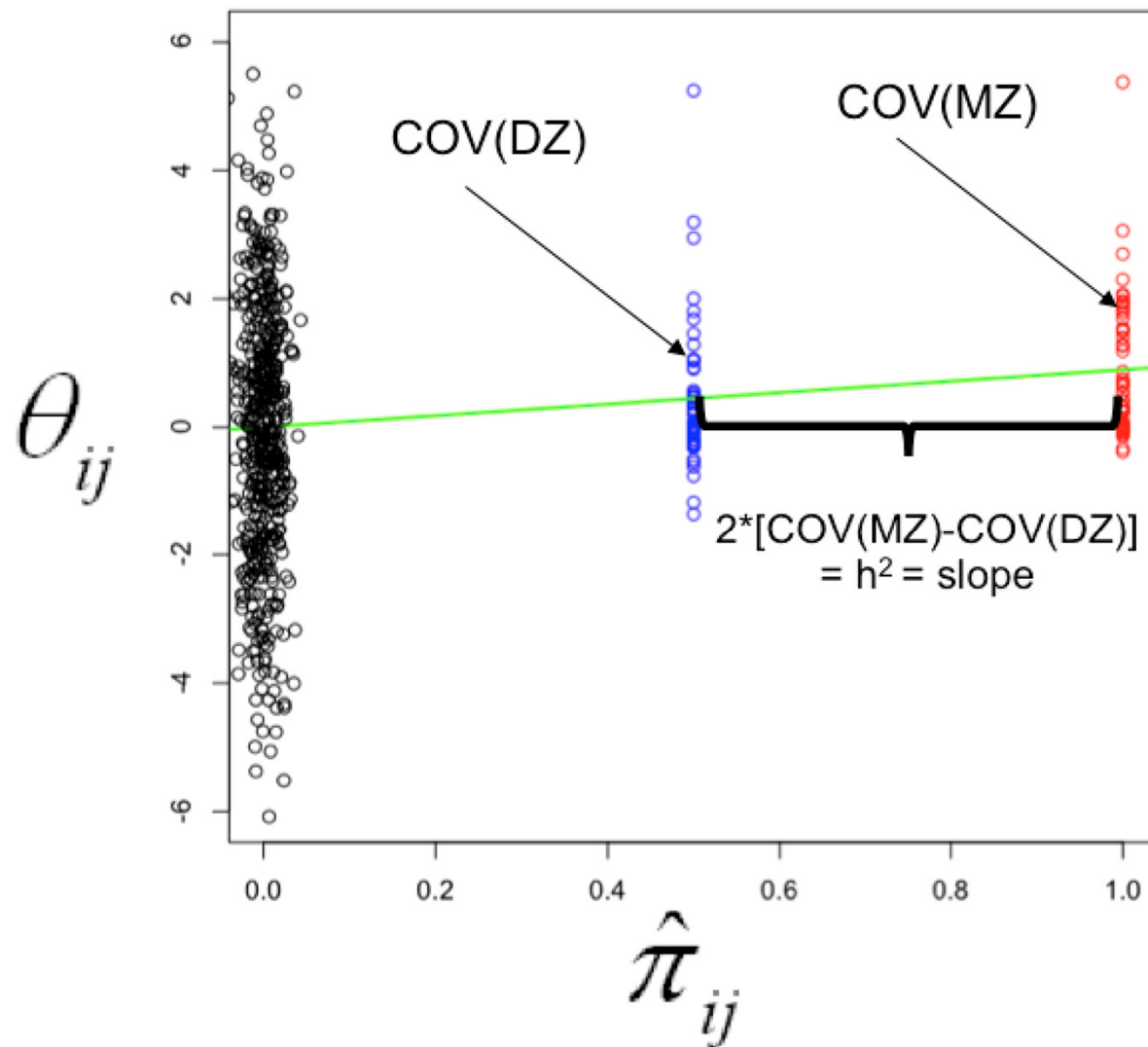
Can use the same approach for  
other relationships

Contributions of  $V_A$  and  $V_D$  to  
covariances between relatives (ignoring

Relationship	environment) Contribution to Covariance	
	$V_A$	$V_D$
Total variance	1	1
Sibling (DZ twin)	$\frac{1}{2}$	$\frac{1}{4}$
MZ twin	1	1
Half-sibling	$\frac{1}{4}$	0
First cousin	$\frac{1}{8}$	0
Parent-offspring	$\frac{1}{2}$	0
Avuncular	$\frac{1}{4}$	0
Grand-parent	$\frac{1}{8}$	0
Unrelated	0 *	0*



# Heritability among unrelateds



# Heritability among unrelateds

- Estimate of  $V_A$  captured by genotyped & imputed variants
  - Upper bound of how much  $V_A$  GWAS can detect
- By not using relatives who also share environmental effects:
  - Does not rely on assumption that  $r(MZ) > r(DZ)$  for purely genetic reasons

<b>Trait or Disease</b>	<b><math>h^2</math> Pedigree Studies</b>	<b><math>h^2</math> GWAS Hits<sup>a</sup></b>	<b><math>h^2</math> All GWAS SNPs<sup>b</sup></b>
Type 1 diabetes	0.9 <sup>98</sup>	0.6 <sup>99, c</sup>	0.3 <sup>12</sup>
Type 2 diabetes	0.3–0.6 <sup>100</sup>	0.05–0.10 <sup>34</sup>	
Obesity (BMI)	0.4–0.6 <sup>101,102</sup>	0.01–0.02 <sup>36</sup>	0.2 <sup>14</sup>
Crohn's disease	0.6–0.8 <sup>103</sup>	0.1 <sup>11</sup>	0.4 <sup>12</sup>
Ulcerative colitis	0.5 <sup>103</sup>	0.05 <sup>12</sup>	
Multiple sclerosis	0.3–0.8 <sup>104</sup>	0.1 <sup>45</sup>	
Ankylosing spondylitis	>0.90 <sup>105</sup>	0.2 <sup>106</sup>	
Rheumatoid arthritis	0.6 <sup>107</sup>		
Schizophrenia	0.7–0.8 <sup>108</sup>	0.01 <sup>79</sup>	0.3 <sup>109</sup>
Bipolar disorder	0.6–0.7 <sup>108</sup>	0.02 <sup>79</sup>	0.4 <sup>12</sup>
Breast cancer	0.3 <sup>110</sup>	0.08 <sup>111</sup>	
Von Willebrand factor	0.66–0.75 <sup>112,113</sup>	0.13 <sup>114</sup>	0.25 <sup>14</sup>
Height	0.8 <sup>115,116</sup>	0.1 <sup>13</sup>	0.5 <sup>13,14</sup>
Bone mineral density	0.6–0.8 <sup>117</sup>	0.05 <sup>118</sup>	
QT interval	0.37–0.60 <sup>119,120</sup>	0.07 <sup>121</sup>	0.2 <sup>14</sup>
HDL cholesterol	0.5 <sup>122</sup>	0.1 <sup>57</sup>	
Platelet count	0.8 <sup>123</sup>	0.05–0.1 <sup>58</sup>	

Variance explained by common SNPs for complex traits

Visscher PM, et.al. (2012) Am J Hum Genetics