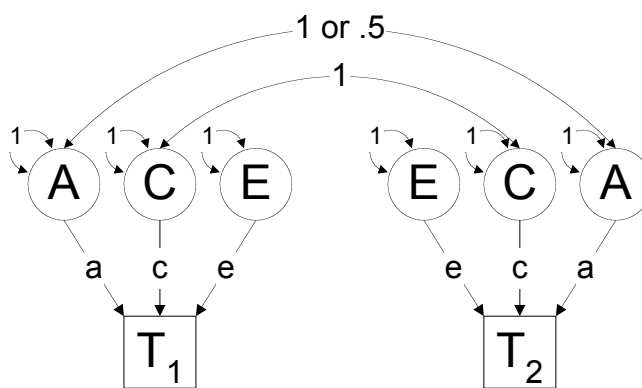


Bivariate analysis

HGEN619 class 2007

Univariate ACE model



Expected Covariance Matrices

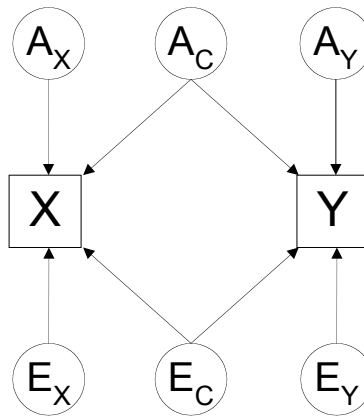
$$E \text{ MZ} = \begin{bmatrix} a^2+c^2+e^2 & a^2+c^2 \\ a^2+c^2 & a^2+c^2+e^2 \end{bmatrix} \quad 2 \times 2$$

$$E \text{ DZ} = \begin{bmatrix} a^2+c^2+e^2 & .5a^2+c^2 \\ .5a^2+c^2 & a^2+c^2+e^2 \end{bmatrix} \quad 2 \times 2$$

Bivariate Questions I

- Univariate Analysis: What are the contributions of additive genetic, dominance/shared environmental and unique environmental factors to the variance?
- Bivariate Analysis: What are the contributions of genetic and environmental factors to the covariance between two traits?

Two Traits



Bivariate Questions II

- Two or more traits can be correlated because they share common genes or common environmental influences
 - e.g. Are the same genetic/environmental factors influencing the traits?
- With twin data on multiple traits it is possible to partition the covariation into its genetic and environmental components
- Goal: to understand what factors make sets of variables correlate or co-vary

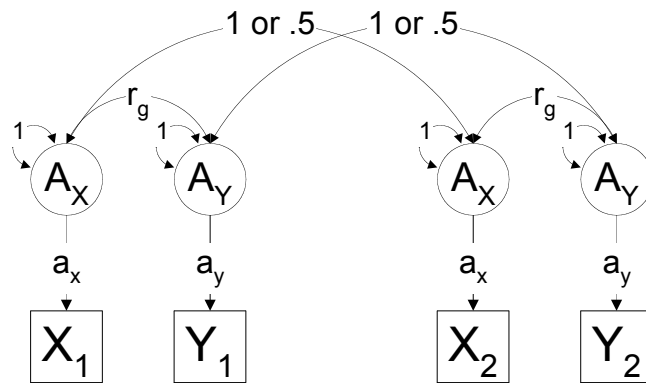
Bivariate Twin Data

		individual twin	
		within	between
trait	within	(within-twin within-trait co)variance	(cross-twin within-trait) covariance
	between	(cross-twin within-trait) covariance	cross-twin cross-trait covariance

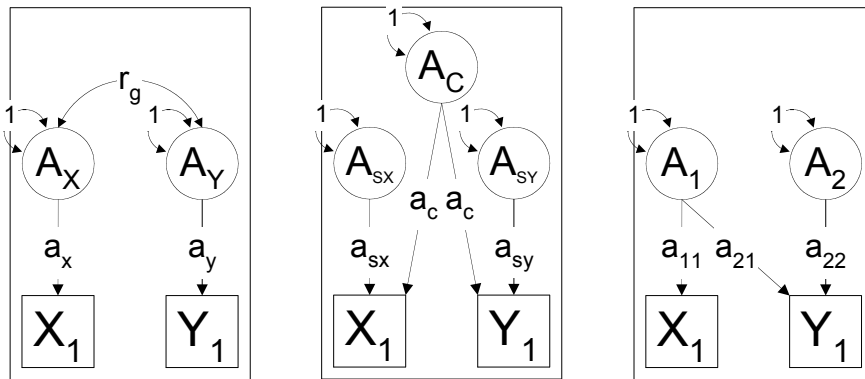
Bivariate Twin Covariance Matrix

	X_1	Y_1	X_2	Y_2
X_1	V_{X1}	C_{X1Y1}	C_{X1X2}	C_{X1Y2}
Y_1	C_{Y1X1}	V_{Y1}	C_{Y1X2}	C_{Y1Y2}
X_2	C_{X2X1}	C_{X2Y1}	V_{X2}	C_{X2Y2}
Y_2	C_{Y2X1}	C_{Y2Y1}	C_{Y2X2}	V_{Y2}

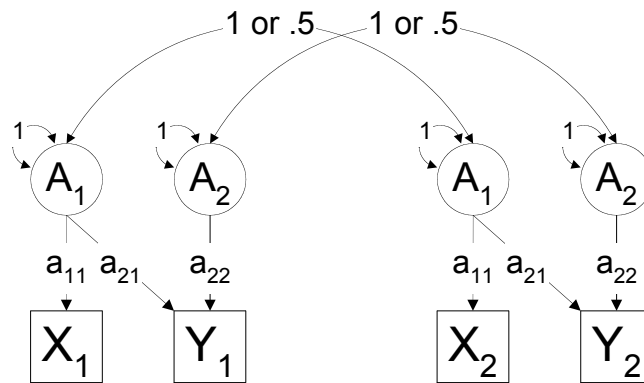
Genetic Correlation



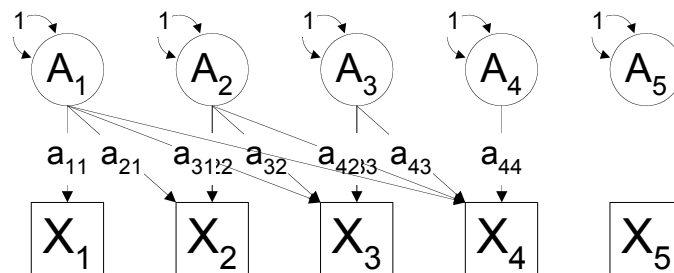
Alternative Representations



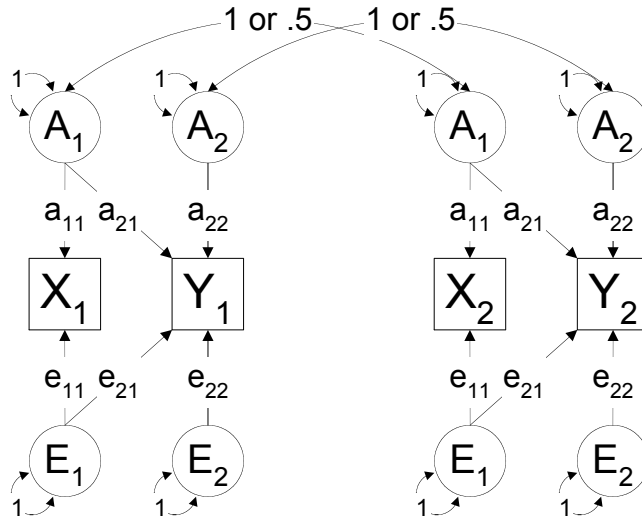
Cholesky Decomposition



More Variables



Bivariate AE Model



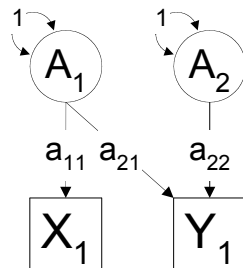
MZ Twin Covariance Matrix

	X_1	Y_1	X_2	Y_2
X_1	$a_{11}^2 + e_{11}^2$		a_{11}^2	
Y_1	$a_{21} * a_{11} + e_{21} * e_{11}$	$a_{22}^2 + a_{21}^2 + e_{22}^2 + e_{21}^2$	$a_{21} * a_{11}$	$a_{22}^2 + a_{21}^2$
X_2				
Y_2				

DZ Twin Covariance Matrix

	X_1	Y_1	X_2	Y_2
X_1	$a_{11}^2 + e_{11}^2$		$.5a_{11}^2$	
Y_1	$a_{21} * a_{11} + e_{21} * e_{11}$	$a_{22}^2 + a_{21}^2 + e_{22}^2 + e_{21}^2$	$.5a_{21} * a_{11}$	$.5a_{22}^2 + .5a_{21}^2$
X_2				
Y_2				

Within-Twin Covariances [Mx]



X Lower 2 2

$$X_1 \begin{bmatrix} A_1 & A_2 \\ a_{11} & 0 \end{bmatrix}$$

$$Y_1 \begin{bmatrix} a_{21} & a_{22} \end{bmatrix}$$

$$A = X * X'$$

$$EA = \begin{bmatrix} a_{11} & 0 \\ a_{21} & a_{22} \end{bmatrix} * \begin{bmatrix} a_{11} & a_{21} \\ 0 & a_{22} \end{bmatrix} = \begin{bmatrix} a_{11}^2 & a_{11} * a_{21} \\ a_{21} * a_{11} & a_{22}^2 + a_{21}^2 \end{bmatrix}$$

Within-Twin Covariances

$$EA = \begin{bmatrix} a_{11}^2 & a_{11} * a_{21} \\ a_{21} * a_{11} & a_{22}^2 + a_{21}^2 \end{bmatrix}$$

$$EE = \begin{bmatrix} e_{11}^2 & e_{11} * e_{21} \\ e_{21} * e_{11} & e_{22}^2 + e_{21}^2 \end{bmatrix}$$

$$EP = EA + EE = \begin{bmatrix} a_{11}^2 + e_{11}^2 & a_{11} * a_{21} + e_{11} * e_{21} \\ a_{21} * a_{11} + e_{21} * e_{11} & a_{22}^2 + a_{21}^2 + e_{22}^2 + e_{21}^2 \end{bmatrix}$$

Cross-Twin Covariances

$$\text{MZ} \quad EA = \begin{bmatrix} a_{11}^2 & a_{11} * a_{21} \\ a_{21} * a_{11} & a_{22}^2 + a_{21}^2 \end{bmatrix}$$

$$\text{DZ} \quad .5 @ EA = \begin{bmatrix} .5a_{11}^2 & .5a_{11} * a_{21} \\ .5a_{21} * a_{11} & .5a_{22}^2 + .5a_{21}^2 \end{bmatrix}$$

Cross-Trait Covariances

- Within-twin cross-trait covariances imply common etiological influences
- Cross-twin cross-trait covariances imply familial common etiological influences
- MZ/DZ ratio of cross-twin cross-trait covariances reflects whether common etiological influences are genetic or environmental

Univariate Expected Covariances

$$E \text{ MZ} = \begin{bmatrix} a^2+c^2+e^2 & a^2+c^2 \\ a^2+c^2 & a^2+c^2+e^2 \end{bmatrix} \quad 2 \times 2$$

$$E \text{ DZ} = \begin{bmatrix} a^2+c^2+e^2 & .5a^2+c^2 \\ .5a^2+c^2 & a^2+c^2+e^2 \end{bmatrix} \quad 2 \times 2$$

Univariate Expected Covariances II

$$E \text{ MZ} = \begin{bmatrix} EA+EC+EE & EA+EC \\ EA+EC & EA+EC+EE \end{bmatrix} \quad 2 \times 2$$

$$E \text{ DZ} = \begin{bmatrix} EA+EC+EE & .5@EA+EC \\ .5@EA+EC & EA+EC+EE \end{bmatrix} \quad 2 \times 2$$

Bivariate Expected Covariances

$$E \text{ MZ} = \begin{bmatrix} EA+EC+EE & EA+EC \\ EA+EC & EA+EC+EE \end{bmatrix} \quad 4 \times 4$$

$$E \text{ DZ} = \begin{bmatrix} EA+EC+EE & .5@EA+EC \\ .5@EA+EC & EA+EC+EE \end{bmatrix} \quad 4 \times 4$$



Practical Example I

- Dataset: MCV-CVT Study
- 1983-1993
- BMI, skinfolds (bic,tri,calf,sil,ssc)
- Longitudinal: 11 years
- N MZF: 107, DZF: 60



Practical Example II

- Dataset: NL MRI Study
- 1990's
- Working Memory, Gray & White Matter

- N MZFY: 68, DZF: 21

! Bivariate ACE model
! NL mri data I

```

■ #NGroups 4
■ #define nvar 2 ! N dependent variables per twin

■ G1: Model Parameters
■ Calculation
■ Begin matrices;
■ X Lower nvar nvar Free ! additive genetic path coefficient
■ Y Lower nvar nvar Free ! common environmental path coefficient
■ Z Lower nvar nvar Free ! unique environmental path coefficient
■ H Full 1 1 !
■ G Full 1 nvar Free ! means
■ End matrices;
■ Matrix H .5
■ Start .5 X 1 1 1 Y 1 1 1 Z 1 1 1
■ Start .7 X 1 2 2 Y 1 2 2 Z 1 2 2
■ Matrix G 6 7
■ Begin algebra;
■ A= X*X'; ! additive genetic variance
■ C= Y*Y'; ! common environmental variance
■ E= Z*Z'; ! unique environmental variance
■ V= A+C+E; ! total variance
■ S= A%V | C%V | E%V ; ! standardized variance components
■ End algebra;
■ Labels Row V WM BBGM
■ Labels Column V A1 A2 C1 C2 E1 E2
■ End

```

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! Bivariate ACE model
! NL mri data II

```

■ G2: MZ twins
■ Data NInputvars=8
■ ! N inputvars per family
■ Missing=-2.0000
■ ! missing values ='-2.0000'
■ Rectangular File=mri.rec
■ Labels fam zyg mem1 gml wml mem2 . .
■ Select if zyg =1 ;
■ Select gml wml gm2 wm2 ;
■ Begin Matrices = Group 1;
■ Means G| G;
■ ! model for means, assuming mean t1=t2
■ Covariances
■ ! model for MZ variance/covariances
■ A+C+E | A+C _
■ A+C | A+C+E ;
■ Options RSiduals
■ End

■ G3: DZ twins
■ Data NInputvars=8
■ Missing=-2.0000
■ Rectangular File=mri.rec
■ Labels fam zyg mem1 gml wml mem2 . .
■ Select if zyg =2 ;
■ Select gml wml gm2 wm2 ;
■ Begin Matrices = Group 1;
■ Means G| G;
■ ! model for means, assuming mean t1=t2
■ Covariances
■ ! model for DZ variance/covariances
■ A+C+E | H@A+C _
■ H@A+C | A+C+E ;
■ Options RSiduals
■ End

```

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! Bivariate ACE model
! NL mri data III

```
■ G4: summary of relevant statistics
■ Calculation
■ Begin Matrices = Group 1
■ Begin Algebra ;
■ R= \stnd(A) | \stnd(C) | \stnd(E); ! calculates rg|rc|re
■ End Algebra ;
■ Interval @95 S 1 1 1 S 1 1 3 S 1 1 5 ! CI's on A,C,E for first phenotype
■ Interval @95 S 1 2 2 S 1 2 4 S 1 2 6 ! CI's on A,C,E for second phenotype
■ Interval @95 R 4 2 1 R 4 2 3 R 4 2 5 ! CI's on rg, rc, re
■ End
```

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