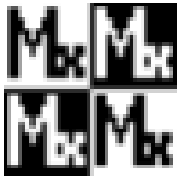




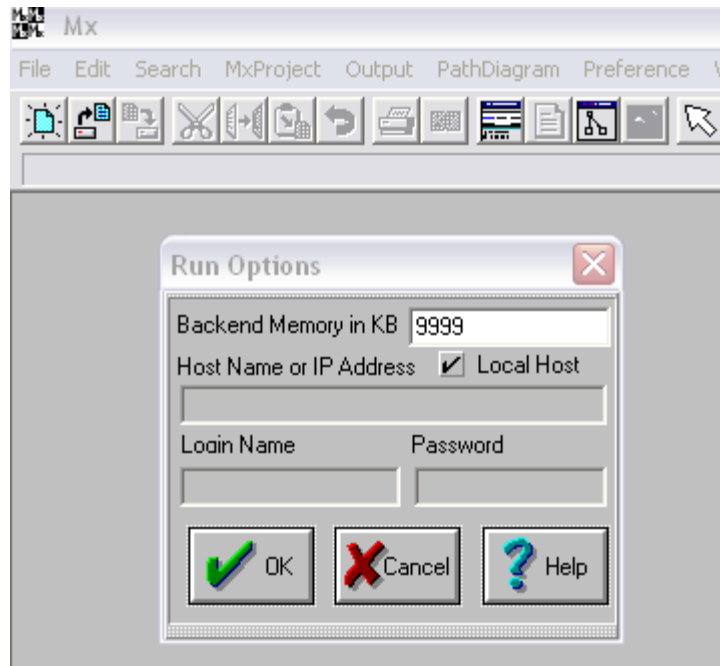
Welcome

- Log on using the username and password you received at registration
- Copy the folder:
F:/sarah/mon-morning
To your H drive



Open Mx and increase memory

- Go to preference
 - Host options
 - Back the backend memory larger



Intro to Mx

Sarah Medland – Leuven 2008





This morning

- Fitting a mean and regression with continuous data
- Modelling Ordinal data
- Fitting the regression model with ordinal data

Lets start with the data...

- File: Wednesday.dat
 - Contains 6 variables from the NLTR
 - ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

ntrid	zygMZDZ	age1	sekse1	AQ1	age2	sekse2	AQ2
2	1	18.12	1	91	18.12	1	95
3	2	18.37	0	90	18.37	1	89
5	2	18.34	0	-1	-4	-4	-1
10	1	18.12	1	-1	18.12	1	-1
15	2	18.52	1	-1	18.5	1	-1
16	2	18.04	1	100	18.04	1	110

Lets start with the data...

ntrid	zygm202	age1	sekse1	AQ1
2	1	18.12	1	91
3	2	18.37	0	90
5	2	18.34	0	-1
10	1	18.12	1	-1
15	2	18.52	1	-1
16	2	18.04	1	100

age2	sekse2	AQ2
18.12	1	95
18.37	1	89
-4	-4	-1
18.12	1	-1
18.5	1	-1
18.04	1	110

If this was a pedigree data file...

ntrid	zygmZDZ	age1	sekse1	AQ1	age2	sekse2	AQ2
2	1	18.12	1	91	18.12	1	95
3	2	18.37	0	90	18.37	1	89
5	2	18.34	0	-1	-4	-4	-1
10	1	18.12	1	-1	18.12	1	-1
15	2	18.52	1	-1	18.5	1	-1
16	2	18.04	1	100	18.04	1	110

Famid	Ind	Father	Mother	Zyg	Sex	Age	Trait
2	1	0	0	0	1	x	x
2	2	0	0	0	2	x	x
2	3	1	2	MZ	1	18.12	91
2	4	1	2	MZ	1	18.12	95

How can we make this data file?

- Assume we have data with 3 variables:

	Family	Individual	Trait
1	1.00	1.00	24.00
2	1.00	2.00	42.00
3	2.00	1.00	21.00
4	2.00	2.00	4.00
5	3.00	1.00	2.00
6	3.00	2.00	1.00
7	4.00	1.00	3.00
8	4.00	2.00	12.00

	Family	Trait.1.00	Trait.2.00
1	1.00	24.00	42.00
2	2.00	21.00	4.00
3	3.00	2.00	1.00
4	4.00	3.00	12.00

How do we make this data?

- SPSS

`SORT CASES BY Family Individual .`

`CASESTOVARS`

`/ID = Family`

`/INDEX = Individual`

`/GROUPBY = VARIABLE .`



Means...

- In spss sas etc we calculate the mean
- In Mx and other ML programs we estimate the mean

Spss...

Untitled - SPSS Data Editor

File Edit View Data Transform Analyze Graphs Utilities Window Help

1 : ntrid 2

	ntrid	zyg5gr	zygMZDZ	age1	sekse1	wit1	som1
1	2.00	3	1	18.12	1.0	2.00	2.00
2	3.00	5	2	18.37	.0	.00	.00
3							.00
4							2.00
5							2.00
6							4.00
7							-4.00
8							.00
9							.00
10							.00
11							3.00
12							1.00
13							.00
14							.00

☐ Descriptives

Variable(s):

- # AQ1

☐ Save standardized values as variables

OK Paste Reset Cancel Help Options...

Spss...

→ Descriptives

Descriptive Statistics

	N	Minimum	Maximum	Mean	Std. Deviation
AQ1	179	75.00	130.00	102.3408	10.41288
Valid N (listwise)	179				

```

#define nvar 1                                ? n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ? Number of variables per family
missing=-1                                   ? Missing values

Rectangular file=wednesday.dat              ? read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

Begin matrices;
    M Full 1 nvar free                      ?mean
    U Full nvar nvar free                   ? variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ? compute Standard deviation
End Algebra;

? start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;      ? means model
Covariances U ;      ? variance/covariance model
end

```

Means.mx

```
#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Missing = 999999 ! Missing = 999999 family
miss
Rec
Lab
ntr

select AQ1 ;

Begin matrices;
    M Full 1 nvar free                        !mean
    U Full nvar nvar free                    ! variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end
```

Defining some frequently
changed parameters

```
#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data: Minimum = 0, Maximum = 1           ! Minimum of variable = 0, Maximum = 1
miss: 0                                ! Missing value = 0
Rectangular file=Wednesday.dat              ! Read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2


select AQ1 ;

Begin matrices;
    M Full 1 nvar free                      !mean
    U Full nvar nvar free                   ! variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end
```



```

#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ! Number of variables per family
missing=-1                                  ! Missing values

Rect
Label
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

Begin matrices;
    M Full 1 nvar free                      !mean
    U Full nvar nvar free                  ! variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ; ! means model
Covariances U ; ! variance/covariance model
end

```

Providing a title

```
#define nvar 1                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1    ! Number of variables per family
missing=-1                      ! Missing values
```

Directly after the title tell Mx
what kind of group it is

- Data
- Calculation
- Constraint

```
! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end
```

```
#define nvar 1                ? n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1    ? Number of variables per family
missing=-1                     ? Missing values
```

How many variables are in the data file

```
Rect
Labo
ntr
sel

Begin matrices;
    M Full 1 nvar free        ?mean
    U Full nvar nvar free    ? variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ? compute Standard deviation
End Algebra;

? start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ? means model
Covariances U ;    ? variance/covariance model
end
```

```
#define nvar 1                ? n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1    ? Number of variables per family
missing=-1                     ? Missing values
```



How many groups in the script

```
Begin matrices;
  M Full 1 nvar free          ?mean
  U Full nvar nvar free      ? variance
End matrices;

Begin Algebra;
  S = \sqrt(U) ; ? compute Standard deviation
End Algebra;

? start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ? means model
Covariances U ;    ? variance/covariance model
end
```

```
#define nvar 1                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1    ! Number of variables per family
missing=-1                      ! Missing values
```

Rec
Lab
ntr

Missing code – default is a .

```
select AQ1 ;

Begin matrices;
    M Full 1 nvar free          !mean
    U Full nvar nvar free       ! variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end
```



```

#define nvar 1                                ? n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ? Number of variables per family
missing=-1                                  ? Missing values

Rectangular file=wednesday.dat              ? read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;


Begin
  U Full nvar nvar Free                    ? variance
End matrices;

Begin Algebra;
  S = \sqrt(U) ; ? compute Standard deviation
End Algebra;

? start values
Start 100 M 1 1
Start 106 U 1 1

Means M ; ? means model
Covariances U ; ? variance/covariance model
end

```



List of the variables

```

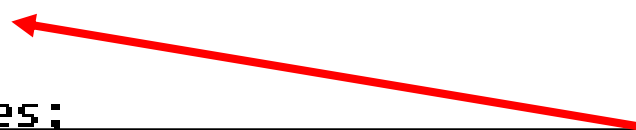
#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ! Number of variables per family
missing=-1                                  ! Missing values

Rectangular file=wednesday.dat              ! read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

```



Tell Mx what to analyse

```

Begin matrices;
  M Fu
  U Fu
End matr

Begin Algebra;
  S = \sqrt(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end

```

```

#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ! Number of variables per family
missing=-1                                   ! Missing values

Rectangular file=wednesday.dat              ! read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

Begin matrices;
    M Full 1 nvar free                      !mean
    U Full nvar nvar free                   ! variance
End matrices;

Begin Algebra;
    S = V
End Algebra;

! start values
Start 100
Start 106 0 1 1

Means M ;                                  ! means model
Covariances U ;                           ! variance/covariance model
end

```

Tell Mx what matrices you want to use

Matrices: the building blocks

- Many types

A Zero 2 3 Free

0 0 0
0 0 0

0 0 0
0 0 0

B Unit 2 3 Free

0 0 0
0 0 0

1 1 1
1 1 1

C Iden 3 3 Free

0 0 0
0 0 0
0 0 0

1 0 0
0 1 0
0 0 1

F Diag 3 3 Free

1 0 0
0 2 0
0 0 3

? 0 0
0 ? 0
0 0 ?

G Sdiag 3 3 Free

0 0 0
1 0 0
2 3 0

0 0 0
? 0 0
? ? 0

H Stand 3 3 Free

0 1 2
1 0 3
2 3 0

1 ? ?
? 1 ?
? ? 1

I Symm 3 3 Free

1 2 4
2 3 5
4 5 6

? ? ?
? ? ?
? ? ?

J Lower 3 3 Free

1 0 0
2 3 0
4 5 6

? 0 0
? ? 0
? ? ?

K Full 2 4 Free

1 2 3 4
5 6 7 8

? ? ? ?
? ? ? ?

Matrices: the building blocks

- Many types
- Denoted by a single letter
 - Elements defined by letter and 3 numbers
 - A_{121} = A matrix group 1 row 2 column 1
- All constants and estimated parameters must be placed in a matrix & Mx must be told what type of matrix it is
- Letters can be reused in subsequent groups

```

#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ! Number of variables per family
missing=-1                                   ! Missing values

Rectangular file=wednesday.dat              ! read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

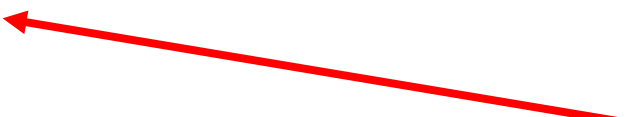
Begin matrices;
    M Full 1 nvar free                      !mean
    V Full nvar nvar free                   ! variance
End matrices;

Begin Algebra;

Er
!
St
St
M = [?] V = [?]

Means M ;                                ! means model
Covariances V ;                          ! variance/covariance model
end

```



M & V matrices are both full 1 1

$M = [?]$ $V = [?]$

```

#define nvar 1                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1    ! Number of variables per family
missing=-1                     ! Missing values

Rectangular file=wednesday.dat    ! read raw data
Labels

```

Tell Mx what algebra you want to do
 S will contain the square root of the
 estimate of V

```

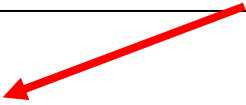
End matrices,

Begin Algebra;
    S = \sqrt(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end

```



```

#define nvar 1                                ! n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ! Number of variables per family
missing=-1                                   ! Missing values

Rectangular file=wednesday.dat              ! read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

```

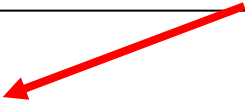
Provide some start values to aid estimation
Default is .01

```

! start values
Start 100 M 1 1
Start 106 U 1 1

Means M ;          ! means model
Covariances U ;    ! variance/covariance model
end

```



```

#define nvar 1                                ? n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ? Number of variables per family
missing=-1                                  ? Missing values

Rectangular file=wednesday.dat              ? read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

Begin matrices;
    M Full 1 nvar free                      ?mean
    U Full nvar nvar free                  ? variance
End matrices;

```

Tell Mx how which matrix contains
the means and the variance/
covariance matrix

```

Means M ;      ← ? means model
Covariances U ;      ? variance/covariance model
end

```

```

#define nvar 1                                ? n dependent variables per individual

G1: Singleton (non-pair) data
Data Ninput_vars=8 NGroups=1                ? Number of variables per family
missing=-1                                   ? Missing values

Rectangular file=wednesday.dat              ? read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 ;

Begin matrices;
    M Full 1 nvar free                      ?mean
    U Full nvar nvar free                   ? variance
End matrices;

Begin Algebra;
    S = \sqrt(U) ; ? compute Standard deviation
End Algebra;

? start values
Start 100 M 1 1


```

Each group needs an end statement

```

Covariances U ;                             ? variance/covariance model
end

```



Output

**** Mx startup successful ****

!@human; **MX-PC 1.63h Job started on 08/10/08 at 17:09:35**
#DEFINE NVAR 1 ! N DEPENDENT VARIABLES PER INDIVIDUAL

The following MX script lines were read for group 1

G1: SINGLETON (NON-PAIR) DATA
DATA NINPUT_VARS=8 NGROUPS=1 ! NUMBER OF VARIABLES PER FAMILY
MISSING=-1 ! MISSING VALUES

NOTE: Missing value *string* set to '-1'

RECTANGULAR FILE=WEDNESDAY.DAT ! READ RAW DATA
Rectangular continuous data read initiated
Note: Maximum ordinal/rectangular record length is: 1000

NOTE: Rectangular file contained 424 records with data
that contained a total of 2891 observations

LABELS
NTRID ZYGMZDZ AGE1 SEKSE1 AQ1 AGE2 SEKSE2 AQ2
SELECT AQ1 ;
BEGIN MATRICES;

NOTE: Selection yields 179 data vectors for analysis
NOTE: Vectors contain a total of 179 observations

→ Descriptives

Descriptive Statistics

	N	Minimum	Maximum	Mean	Std. Deviation
AQ1	179	75.00	130.00	102.3408	10.41288
Valid N (listwise)	179				

Summary of UL file data for group 1

	AQ1
Code	1.0000
Number	179.0000
Mean	102.3408
Variance	107.8224
Minimum	75.0000
Maximum	130.0000

G1: Singleton (non-pair) data

MATRIX M
This is a FULL matrix of order
1
1 102.3408

MATRIX S
This is a computed FULL matrix
[= \sqrt{U}]
1
1 10.3838

MATRIX U
This is a FULL matrix of order
1
1 107.8224

→ Descriptives

Descriptive Statistics

	N	Minimum	Maximum	Mean	Std. Deviation
AQ1	179	75.00	130.00	102.3408	10.41288
Valid N (listwise)	179				

- Spss assumes this is a sample
- Mx assumes this is a population
- Slightly different algebra

G1: Singleton (non-pair) data

```
MATRIX M
This is a FULL matrix of order
      1
1      102.3408
```

```
MATRIX S
This is a computed FULL matrix
[=\SQRT(U)]
      1
1      10.3838
```

```
MATRIX U
This is a FULL matrix of order
      1
1      107.8224
```

How about regression?

- $Y = X * B + C$
- Regression speak
 - AutismQuotient = Sex * Beta1 + Age * Beta2 + Intercept
- BG speak
 - AutismQuotient = Sex Effect + Age Effect + Grand Mean

Spss...

Linear Regression

Dependent: # AQ1

Block 1 of 1

Independent(s): # age1, # sekse1

Method: Enter

Selection Variable: Rule...

Case Labels:

WLS Weight:

Statistics... Plots... Save... Options...

OK Paste Reset Cancel Help

ntrid
zyg5gr
zygMZDZ
age1
sekse1
wit1
som1
anx1
soc1
tho1
att1
del1
agg1
age2
sekse2
wit2
som2
anx2
soc2

regression.mx

```
#define nvar 1                ? n dependent variables per individual
#define ndef 2                ? n covariates per individual

G1: Singleton data - Regression
Data Ninput_vars=8 NGroups=1
missing=-1                    ? Missing values

Rectangular file=wednesday.dat
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select age1 sekse1 AQ1 ;
Definition age1 sekse1 ;
```

regression.mx

Begin matrices;

? intercept

? aka grand mean, aka intercept, aka observed variable, aka mean
C Full 1 nvar free

? independent variable

? aka observed covariates for individual
X Full 1 ndef fix

? beta

? aka covariate effect
B Full ndef 1 free

? variance

U Full nvar nvar free

End matrices;

regression.mx

```
! tell Mx to put the independent variables in the X matrix
Specify X age1 sekse1 ;
```

```
! start values
Start 95 C 1 1
Start 106 U 1 1
Start .5 B 1 1
Start 2 B 2 1
```

```
Begin Algebra;
```

```
! Write out the regression equation for the observed (dependent) variable - Y
Y = X*B + C ;
```

```
End Algebra;
```

```
Means Y ; ! means model
Covariances U ; ! variance/covariance model
Option multiple
Option issat
end
```

Regression

Variables Entered/Removed^b

Model	Variables Entered	Variables Removed	Method
1	sekse1, age1 ^a	.	Enter

a. All requested variables entered.

b. Dependent Variable: AQ1

Model Summary

Model	R	R Square	Adjusted R Square	Std. Error of the Estimate
1	.126 ^a	.016	.005	10.38881

a. Predictors: (Constant), sekse1, age1

ANOVA^b

Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	305.003	2	152.501	1.413	.246 ^a
	Residual	18995.210	176	107.927		
	Total	19300.212	178			

a. Predictors: (Constant), sekse1, age1

b. Dependent Variable: AQ1

Coefficients^a

Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.
		B	Std. Error	Beta		
1	(Constant)	93.564	65.862		1.421	.157
	age1	.549	3.623	.011	.151	.880
	sekse1	-2.608	1.558	-.125	-1.673	.096

a. Dependent Variable: AQ1



Run regression.mx

Coefficients^a

Model	Unstandardized Coefficients		Standardized Coefficients	t	Sig.
	B	Std. Error	Beta		
1 (Constant)	93.564	65.862		1.421	.157
age1	.549	3.623	.011	.151	.880
sekse1	-2.608	1.558	-.125	-1.673	.096

a. Dependent Variable: AQ1

G1: Singleton data - Regression

MATRIX B

This is a FULL matrix of order 2 by 1

```

1      0.5487
2     -2.6080
```

MATRIX C

This is a FULL matrix of order 1 by 1

```

1     93.5636
```

What does this mean?

	SEKSE1	AGE1
Code	-2.0000	-1.0000
Number	179.0000	179.0000
Mean	0.4581	18.1749
Variance	0.2482	0.0459
Minimum	0.0000	17.6100
Maximum	1.0000	18.9900

- Age Beta = .549
 - For every 1 unit increase in Age the mean shifts .549
 - Grand mean = 93.564
 - Mean Age = 18.2
- So the mean for 20 year olds is predicted to be:
 - $104.544 = 93.564 + 20 * .549$

Sex effects?

- Sex Beta = -2.608
- Sex coded Male = 1 Female = 0
- Female Mean:
 - $93.564 = 93.564 + 0 \times -2.608$
- Male Mean:
 - $90.656 = 93.564 + 1 \times -2.608$

How do we get the p-values?

Coefficients^a

Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.
		B	Std. Error	Beta		
1	(Constant)	93.564	65.862		1.421	.157
	age1	.549	3.623	.011	.151	.880
	seks1	-2.608	1.558	-.125	-1.673	.096

a. Dependent Variable: AQ1

Set the elements to equal 0 regression.mx

- Do this one at a time!

```
save temp.mxs  
drop B 1 1 1  
end
```

```
get temp.mxs  
drop B 1 2 1  
end
```



		Unstandardized Coefficients		Standardized Coefficients	t	Sig.
		B	Std. Error	Beta		
1	(Constant)	93.564	65.862		1.421	.157
	age1	.549	3.623	.011	.151	.880
	seksel	-2.608	1.558	-.125	-1.673	.096

a. Dependent Variable: AQ1

[illegible]



Why bother with Mx?

- Because most stat packages can't handle non-independent data...
 - Non-independence reduces the variance
 - Biases t and F tests



Why bother with Mx?

- Because we want complete flexibility in the model specification...
 - As you see later today



Why bother with Mx?

- Because very few packages can handle ordinal data adequately...



Working with non-independent data

Correlation.mx

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family

G1: Corelation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;

Begin matrices;
    M Full 1 nvar free          !mean
    U Symm nsib nsib free      ! variance
End matrices;

Begin Algebra;
    S = \stnd(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1 U 2 2
Start 50 U 2 1
EQ U 1 1 U 2 2

Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family
```

Defining the nsib as the number of siblings per family

```
data numpac_vars 0 numpacs 1          ! number of variables per family
missing=-1          ! Missing values
```

```
Rectangular file=wednesday.dat          ! read raw data
```

```
Labels
```

```
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2
```

```
select AQ1 AQ2 ;
```

```
Begin matrices;
```

```
    M Full 1 nvar free          !mean
```

```
    U Symm nsib nsib free      ! variance
```

```
End matrices;
```

```
Begin Algebra;
```

```
    S = \stnd(U) ; ! compute Standard deviation
```

```
End Algebra;
```

```
! start values
```

```
Start 100 M 1 1
```

```
Start 106 U 1 1 U 2 2
```

```
Start 50 U 2 1
```

```
EQ U 1 1 U 2 2
```

```
Means M|M ;          ! means model
```

```
Covariances U ;          ! variance/covariance model
```

```
end
```

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family

G1: Corelation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;
```

Selecting the AQ variable for sib 1 and sib 2

```
      U Symm nsib nsib free          ! variance
End matrices;

Begin Algebra;
      S = \stnd(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 106 U 1 1 U 2 2
Start 50 U 2 1
EQ U 1 1 U 2 2

Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family

G1: Correlation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;

Begin matrices;
  M Full 1 nvar free          !mean
  U Symm nsib nsib free      ! variance
End matrices;
```

The V matrix is now a symmetric 2 2 matrix

Var1 Cov

Cov Var2

```
Start 100 M 1 1
Start 106 U 1 1 U 2 2
Start 50 U 2 1
EQ U 1 1 U 2 2
```

```
Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number of siblings per family

G1: Correlation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
n
s
B
r
End matrices,

Begin Algebra;
  S = \stnd(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 100 U 1 1 U 2 2
Start 50 U 2 1
EQ U 1 1 U 2 2

Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

The S matrix will contain the standardised var/cov matrix (ie the correlation)

1	r
r	1

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family

G1: Corelation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;

Begin matrices;
  M Full 1 nvar free          !mean
  U Symm nsib nsib free      ! variance
End matrices;

Begin Algebra;
```

Some extra start values

```
! start values
Start 100 M 1 1
Start 106 U 1 1 U 2 2
Start 50 U 2 1
EQ U 1 1 U 2 2

Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family

G1: Correlation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
ntrid zygMZDZ age1 sekse1 AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;

Begin matrices;
  M Full 1 nvar free          !mean
  U Symm nsib nsib free      ! variance
End matrices;

Begin Algebra;
  S = \stnd(U) ; ! compute Standard deviation
End Algebra;

EQ V 1 1 V 2 2 sets the variances to be the same for the two
siblings.

start 50 0 2 1
EQ U 1 1 U 2 2

Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

Correlation.mx

```
#define nvar 1          ! n dependent variables per individual
#define nsib 2          ! number if siblings per family

G1: Corelation between twin pairs
Data Ninput_vars=8 NGroups=1          ! Number of variables per family ____
missing=-1                          ! Missing values

Rectangular file=wednesday.dat        ! read raw data
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;

Begin matrices;
  M Full 1 nvar free          !mean
  U Symm nsib nsib free      ! variance
End matrices;

Begin Algebra;
  S = \stnd(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
```

We are also using the same mean for both siblings

$M|M$ = stack 2 M matrices side by side

```
Means M|M ;          ! means model
Covariances U ;      ! variance/covariance model
end
```

Output – correlation.mxo

Summary of UL file data for group 1 G1: Corelation between twin pairs

	AQ1	AQ2
Code	1.0000	2.0000
Number	179.0000	168.0000
Mean	102.3408	102.0893
Variance	107.8224	106.8789
Minimum	75.0000	73.0000
Maximum	130.0000	136.0000

Notice the small increase in variance when accounting for the non-independence

```
MATRIX M
This is a FULL matrix of order      1 by      1
      1
1      102.1865

MATRIX S
This is a computed FULL matrix of order      2 by
[=\STND(U)]
      1      2
1      1.0000      0.3791
2      0.3791      1.0000

MATRIX U
This is a SYMMETRIC matrix of order      2 by
      1      2
1      107.8418
2      40.8812      107.8418

Your model has      3 estimated parameters and

-2 times log-likelihood of data >>> 2584.422
Degrees of freedom >>>>>>>>>>>>>>>> 344
Akaike's Information Criterion >>>> 1896.422
Bayesian Information Criterion >>>> 390.630
Sample size Adjusted BIC >>>> 935.445
Deviance Information Criterion >>>> 706.745
```

Re-conceptualising the correlation

```
MATRIX S
This is a computed FULL matrix
[=\STND(U)]
      1      2
1    1.0000  0.3791
2    0.3791  1.0000
```

```
MATRIX U
This is a SYMMETRIC matrix
      1      2
1    107.8418
2    40.8812  107.8418
```

- The correlation is the standardised covariance – an index of the amount of variance shared between the 2 variables or 2 individuals
- The variance of each variable is composed of that which is shared and that which is not
 - $V = S + N$

Re-conceptualising the correlation

MATRIX S

This is a computed FULL matrix
[= $\sqrt{\text{STND}(U)}$]

	1	2
1	1.0000	0.3791
2	0.3791	1.0000

MATRIX U

This is a SYMMETRIC matrix

	1	2
1	107.8418	
2	40.8812	107.8418

○ $V = S + N$

○ So another way to model the covariance would be

$$S + N \mid S_{-}$$

$$S \mid S + N ;$$

```

#define nvar 1                ! n dependent variables per individual
#define nsib 2                ! number if siblings per family

G1: Correlation between twin pairs
Data Ninput_vars=8 NGroups=1    ! Number of variables per family
missing=-1                    ! Missing values

Rectangular file=wednesday.dat    ! read raw data
Labels
ntrid zygMZDZ age1 sekse1  AQ1 age2 sekse2 AQ2

select AQ1 AQ2 ;

Begin matrices;
    M Full 1 nvar free        !mean
    S Full nvar nvar free    ! shared variance
    N Full nvar nvar free    ! non-shared variance
End matrices;

Begin Algebra;
    U = S+N | S
        S | S+N ;
    C = \stdn(U) ; ! compute Standard deviation
End Algebra;

! start values
Start 100 M 1 1
Start 50 S 1 1 N 1 1

Means M|M ;    ! means model
Covariances U ;    ! variance/covariance model
end

```

Alt_correlation.mx



- Correlation.mtx

[illegible]

- Alt_correlation.mx

```

MATRIX N
This is a FULL matrix of order      1 by      1
1      66.9606

```

```

MATRIX S
This is a FULL matrix of order      1 by      1
              1
1      40.8812

```

```

MATRIX U
This is a computed FULL matrix of order      2
[=S+N|S_S|S+N]
           1           2
1      107.8418      40.8812
2      40.8812      107.8418

```

[illegible]

Twin modelling takes this 1 step further

- Covariance

Var1 | Cov_
Cov | Var 2 ;

- MZ

A+C+E | A+C_
A+C | A+C+E ;

- DZ

A+C+E | .5*A+C_
.5*A+C | A+C+E ;

- A = Additive genetic variance
- C = Common environment variance
- E = unique Environmental variance (including measurement Error)



Working with ordinal data

Binary data

- File: two_cat.dat
- NI=5
- Labels Zyg twin1 twin2 Age Sex
- Trait – smoking initiation
 - Never Smoked/Ever Smoked
 - (Recoded from yesterday)
 - Data is sorted to speed up the analysis

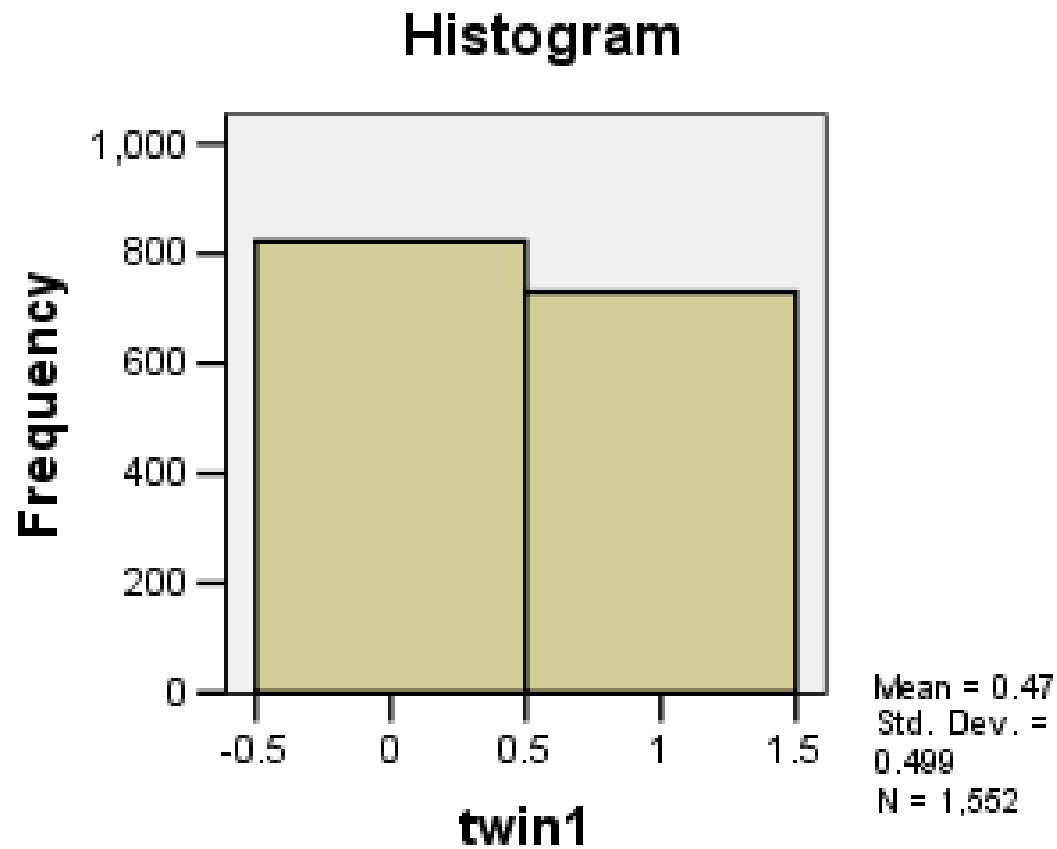
1	0	0	25.80	1
1	0	0	21.10	1
1	0	0	21.79	1
1	0	0	21.12	1
1	0	0	32.05	1
1	0	0	37.41	1
1	0	0	33.56	0
1	0	0	32.78	1
1	0	0	39.19	0
1	0	0	33.33	1

Twin 1 smoking initiation

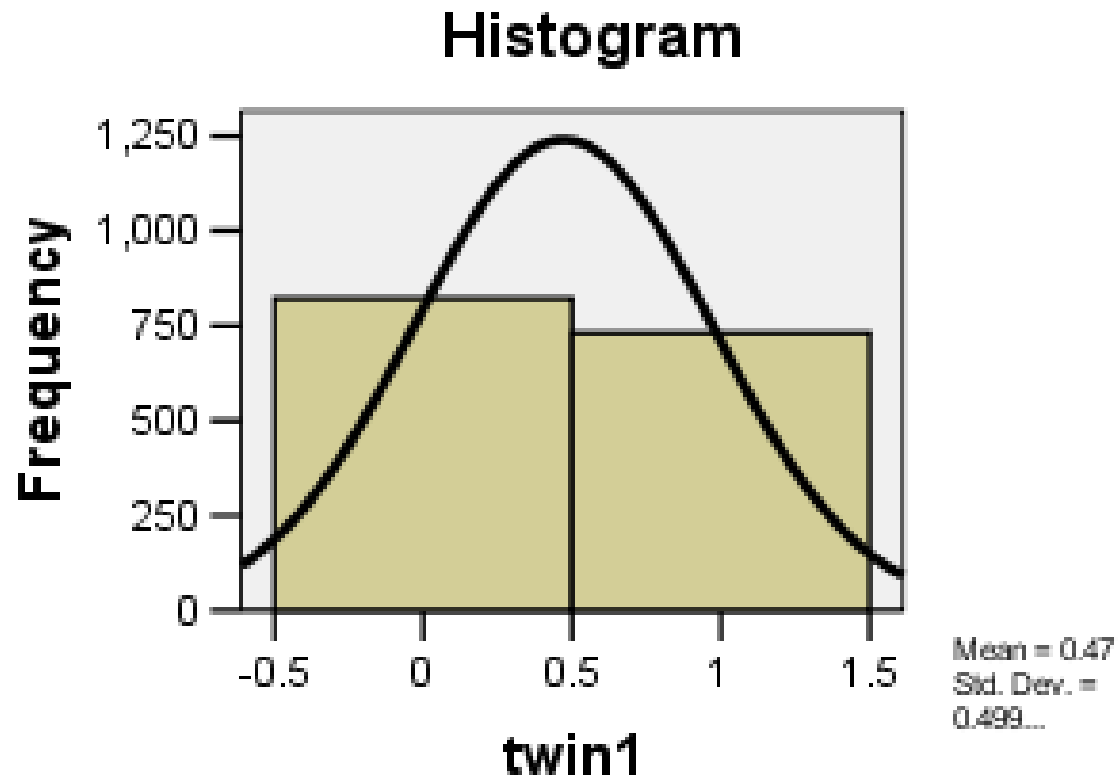
twin1

		Frequency	Percent	Valid Percent	Cumulative Percent
Valid	0	822	47.5	53.0	53.0
	1	730	42.2	47.0	100.0
	Total	1552	89.7	100.0	
Missing	System	179	10.3		
Total		1731	100.0		

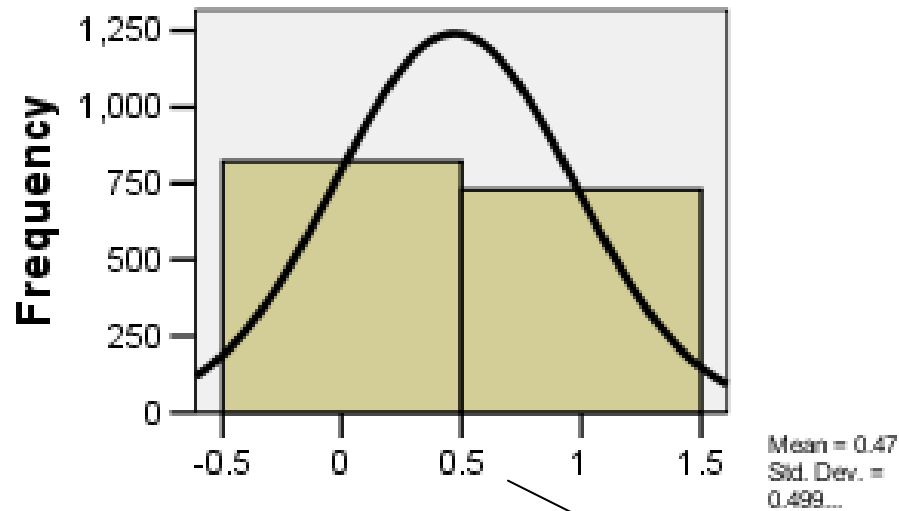
Twin 1 smoking initiation



Twin 1 smoking initiation

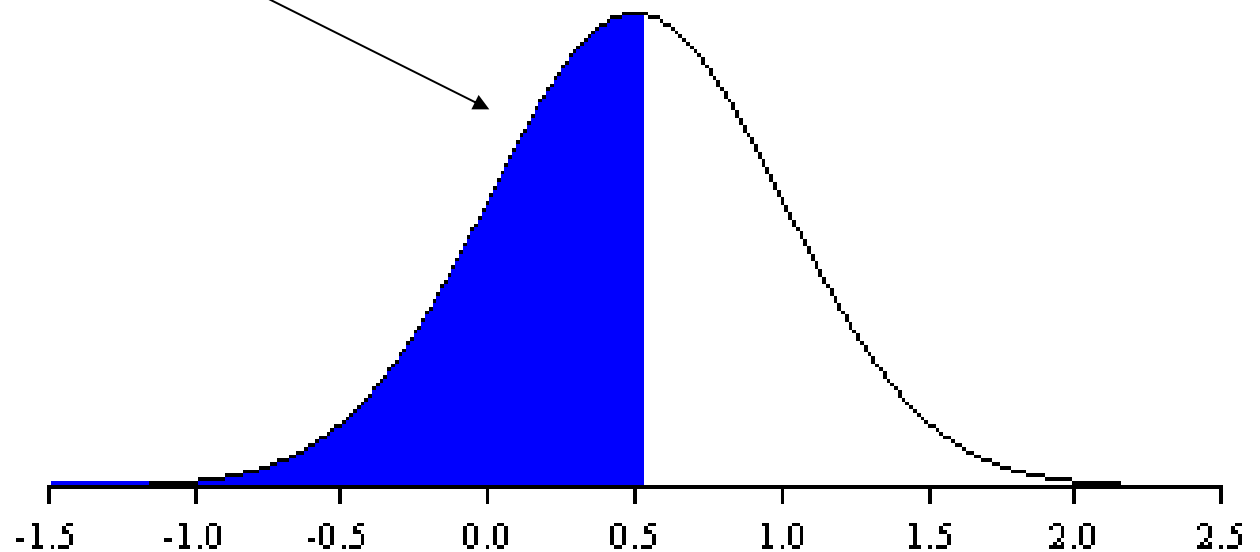


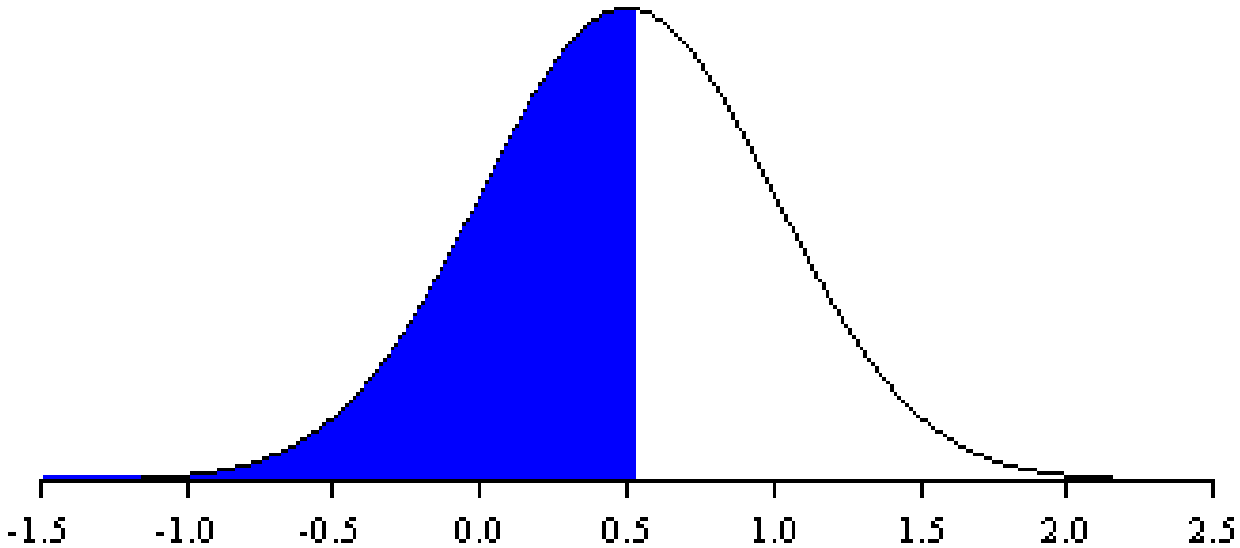
Histogram



twin1

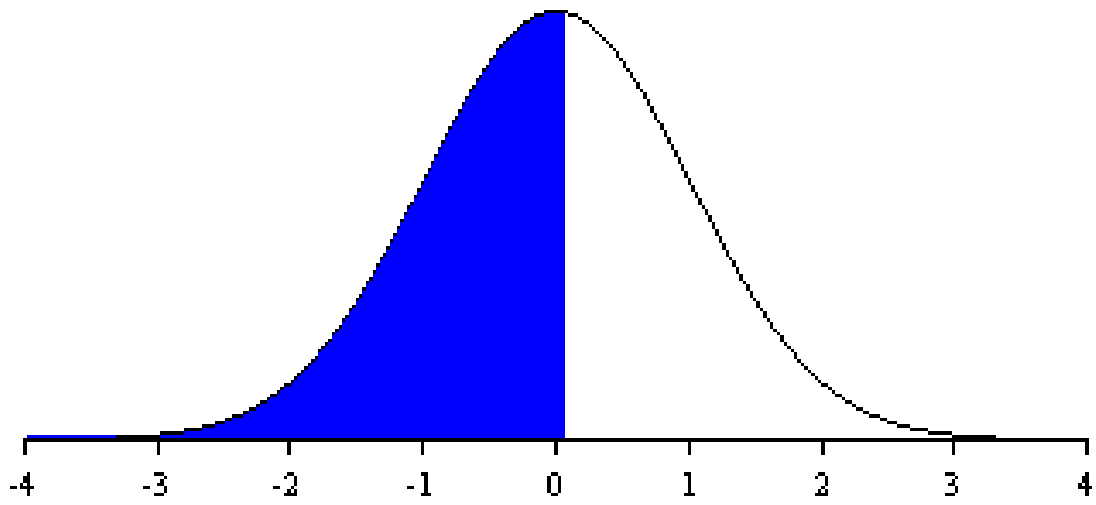
Mean	= .47
SD	= .499
Non Smokers	= 53%





Raw data distribution

Mean	= .47
SD	= .499
Non Smokers	= 53%
Threshold	= .53



Standard normal distribution

Mean	= 0
SD	= 1
Non Smokers	= 53%
Threshold	= .074

Threshold = .074 – Huh what?

- How can I work this out
 - Excel
 - =NORMSINV()

B2		▼	<i>f_x</i>	=NORMSINV(B1)
	A			B
1	Percent of non-smokers			0.52964
2	Threshold			0.074365
3				



Why do we rescale the data this way?

- Convenience

- Variance always 1
- Mean is always 0
- We can interpret the area under a curve between two z-values as a probability or percentage



Why do we rescale the data this way?

You could use other distributions
but **you** would have to specify
the fit function

Threshold.mx

```
#define nvar 1

G1: Singleton (non-pair) ordinal data
Data Ninput_vars=5 NGroups=1

Ordinal file=two_cat.dat
Labels
Zyg Twin1 Twin2 Age Sex

select twin1 ;

Begin matrices;
    T Full 1 nvar free          ? Threshold
    U Stand nvar nvar free      ? variance
End matrices;

? start values
Start 0 T 1 1

Thresholds T ;
Covariances U ;          ? variance/covariance model
end
```

B2		▼	<i>f_x</i> =NORMSINV(B1)
	A	B	
1	Percent of non-smokers	0.52964	
2	Threshold	0.074365	
3			

G1: Singleton (non-pair) ordinal data

MATRIX T

This is a FULL matrix of order 1 by 1

```

      1
1    0.0744

```

MATRIX U

This is a STANDARDISED matrix of order 1 by 1

```

      1
1    1.0000

```

How about age/sex correction?

binary_regression.mx

```
#define nvar 1
#define ndef 2

G1: Singleton (non-pair) ordinal data
Data Ninput_vars=5 NGroups=1

Ordinal file=two_cat.dat
Labels Zyg Twin1 Twin2 Age Sex

select twin1 Age Sex;
definition Age Sex;

Begin matrices;
  T Full 1 nvar free          ? Threshold
  B Full ndef 1 free          ? Beta
  D Full 1 ndef               ? Age
  U Stand nvar nvar free      ? variance
End matrices;

? start values
Start 0 T 1 1

? place covariate in d matrix
Specify D Age Sex

Thresholds T + D*B ;
Covariances U ;          ? variance/covariance model
end
```

How about age/sex correction?

G1: Singleton (non-pair) ordinal data

```
MATRIX B
This is a FULL matrix of order      2 by      1
      1
1      0.0070
2     -0.0500
```

```
MATRIX D
This is a FULL matrix of order      1 by      2
      1      2
1     37.1300      0.0000
```

```
MATRIX T
This is a FULL matrix of order      1 by      1
      1
1     -0.1118
```

What does this mean?

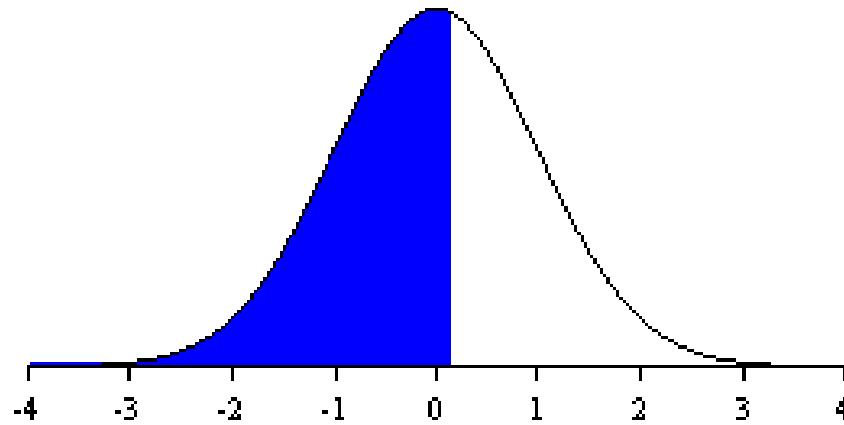
- Age Beta = .007
 - For every 1 unit increase in Age the threshold shifts .007

Summary of VL file data for group 1

	SEX	AGE	TWIN1
Code	-2.0000	-1.0000	1.0000
Number	1552.0000	1552.0000	1552.0000
Mean	0.4826	30.0439	0.4704
Variance	0.2497	33.1815	0.2491
Minimum	0.0000	20.0000	0.0000
Maximum	1.0000	39.9800	1.0000

What does this mean?

- Beta = .007
- Threshold is $-.1118$
- 38 is $+1.38$ SD from the mean age
 - The threshold for 38 year olds is:
 $.1544 = -.1118 + .007 * 38$
- 22 is -1.38 SD from the mean age
 - The threshold for 38 year olds is:
 $.0422 = -.1118 + .007 * 22$

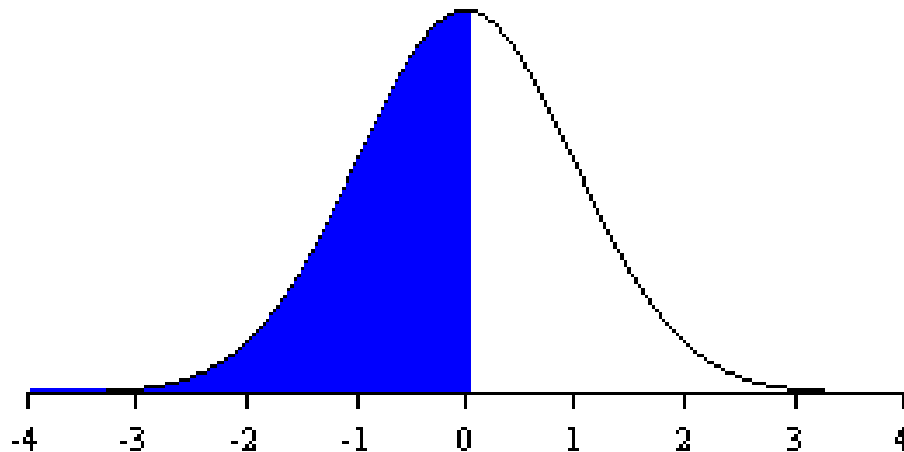


38 year olds

Threshold = .1544



Is the age effect
significant?



22 year olds

Threshold = .0422

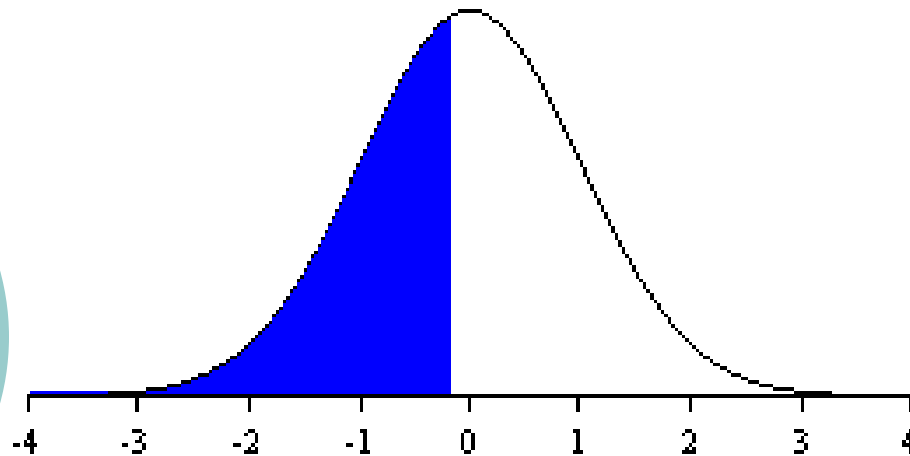


How to interpret this

- The threshold moved **slightly** to the right as age increases
- This means younger people were more likely to have tried smoking than older people
 - But this was not significant

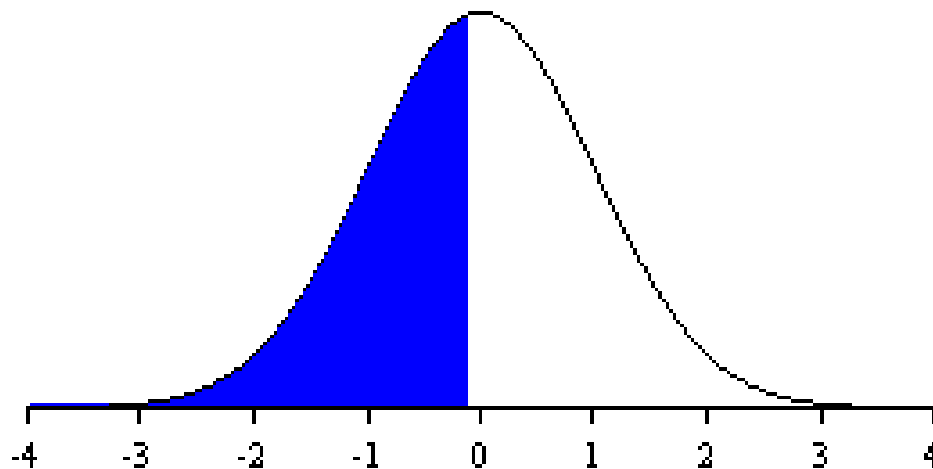
How about the sex effect

- Beta = $-.05$
- Threshold = $-.1118$
- Sex coded Male = 1, Female = 0
- So the Male threshold is:
 - $-.1618 = -.1118 + 1 * -.05$
- The Female threshold is:
 - $-.1118 = -.1118 + 0 * -.05$



Male

Threshold = -.1618



Are males or
females more
likely to smoke?

Female

Threshold = -.1118



General Advice/Problem solving

- Scripting styles differ
- Check the parameter numbers
- Check the sample description
- Learn to love the manual
- Comments are your friends

Time for coffee

