

Conlquent: because all three models share the same mean structure ( $X\beta \Rightarrow \text{rank}(X) = r$  for all  $\beta$ )

> # Compare the fit of various covariance REML est.  
> # structures. is based on the same likelihood function  $\Rightarrow$  making AIC, BIC, logLik  
>  
> anova(o.cs, o.un)

	Model	df	AIC	BIC	logLik	Test	L.Ratio	p-value
o.cs		1	23	1466.8	1557.3	-710.4		
o.un		2	49	1332.9	1525.7	-617.4	1 vs 2	185.92 <.0001

Unstructured Var-Cov matrix provides a much better fit

comparable

> anova(o.ar1, o.un)

Smaller is better

	Model	df	AIC	BIC	logLik	Test	L.Ratio	p-value
o.ar1		1	23	1312.8	1403.3	-633.4		
o.un		2	49	1332.9	1525.7	-617.4	1 vs 2	31.908 0.1962

$\Rightarrow$  lack sufficient evidence in favor of the unstructured Var-Cov-matrix  $\Rightarrow$  AR(1) structure provides best fit out of all three models

## AIC and BIC for Repeated Measures in R

- $AIC = -2\ell(\hat{\theta}) + 2k$  reason for why  
D. un had a larger  
AIC/BIC
- $BIC = -2\ell(\hat{\theta}) + k \ln(n)$
- $k = \underbrace{\text{number of mean parameters (rank of } X\text{)}}_{+ \text{number of variance parameters}}$  Careful when basing model comparisons on AIC, BIC and  $\log L(\theta)$  when using REML
- For REML,  $n = \underline{\text{total number of observations}} - \underline{\text{rank}(X)}$
- For ML,  $n = \underline{\text{total number of observations}}$

## More about Repeated Measures in R

If you are interested in learning about how to fit other variance-covariance structures in R, the following help commands may be useful.

?corClasses

?varClasses

explore functionalities  
of lme & gls before

To see functions for accessing lme and gls results, use

methods(class = 'lme')

fitting different  
Repeated Measures  
Model

methods(class = 'gls')

## Fitting More Complex Models in R

~~discussed~~  
during lecture 40

See RepeatedMeasures.R for several other examples,  
including

Note in R code model comparison is  
based on refitting all models using

- treating time as a continuous variable and assuming a mean function that is quadratic in time for each program
- assuming random subject-specific coefficients when the mean function is quadratic in time for each program

"MLE"

because the mean structure  
is no longer the same