

Week 3 Test Exercise

(a)

$$\text{AIC: } \log(s^2) + 2k/n$$

$$\text{Small model: } \text{AIC}_0 = \log(s_0^2) + 2p_0/n$$

$$\text{Big model: } \text{AIC}_1 = \log(s_1^2) + 2p_1/n$$

AIC: Choose small model if

$$\text{AIC}_0 < \text{AIC}_1$$

$$\log(s_0^2) + 2p_0/n < \log(s_1^2) + 2p_1/n$$

$$\log(s_0^2 / s_1^2) < 2/n*(p_1 - p_0)$$

$$s_0^2 / s_1^2 < e^{2/n*(p_1 - p_0)}$$

(b)

Given:

$$e^x \approx 1 + x \text{ (if } x \text{ is small)}$$

If n is very large, $(2/n)(p_1 - p_0)$ is small. Therefore

$$e^{2/n*(p_1 - p_0)} \approx 1 + 2/n*(p_1 - p_0) \text{ (if } n \text{ is very large)}$$

Substituting this expression into the right side of the result from part (a) yields

$$s_0^2 / s_1^2 < 1 + 2/n*(p_1 - p_0) \text{ (for } n \text{ very large)}$$

$$s_0^2 / s_1^2 - 1 < 2/n*(p_1 - p_0)$$

$$(s_0^2 - s_1^2) / s_1^2 < 2/n*(p_1 - p_0) \text{ (for } n \text{ very large)}$$

(c)

$$s^2 = 1/(n-1) \sum_{i=1}^n e_i^2 = 1/(n-1)*e'e$$

$$\Rightarrow s_0^2 = 1/(n-1)*e_R'e_R, s_1^2 = 1/(n-1)*e_U'e_U$$

Substituting these expressions into the result from part (b) yields

$$(1/(n-1)*e_R'e_R - 1/(n-1)*e_U'e_U) / (1/(n-1)*e_U'e_U) < 2/n*(p_1 - p_0)$$

$$(e_R'e_R - e_U'e_U) / e_U'e_U < 2/n*(p_1 - p_0)$$

(d)

F-test (formula from Lecture 2.4.2 slides):

$$F = \frac{(e_R'e_R - e_U'e_U)/g}{e_U'e_U/(n - k)}$$

where k is the number of explanatory factors in the unrestricted model, and g is the number of explanatory factors removed from the unrestricted model to create the restricted model.

Under this test, we believe there is significant evidence to suggest that $\beta \neq 0$ (so the unrestricted model is preferred) if $F > F_{\text{critical}}$. Therefore a larger model is preferred if $F > F_{\text{critical}}$, and we stay with (prefer) a smaller model if $F < F_{\text{critical}}$.

Let $F_{\text{critical}} = 2$. Then a smaller model is preferred if $F < 2$:

$$\frac{(e_R'e_R - e_U'e_U)/g}{e_U'e_U/(n - k)} < 2$$

In this case, with p_1 factors in the unrestricted model and p_0 in the restricted model, we get

$$\frac{(e_R'e_R - e_U'e_U)/(p_1 - p_0)}{e_U'e_U/(n - p_1)} < 2$$

$$(e_R'e_R - e_U'e_U) / (e_U'e_U) < 2(p_1 - p_0) / (n - p_1)$$

If n is very large, $n - p_1 \approx n$. Then we get the desired result:

$$(e_R'e_R - e_U'e_U) / (e_U'e_U) < 2(p_1 - p_0) / n$$

is our condition for preferring a restricted model when doing an F-test with $F_{\text{critical}} = 2$ (and when n is very large), just as it was our condition for preferring a restricted model when using the AIC (when n is very large).