

**Stat 112**  
**Fall 24 – Mahtash Esfandiari and Jiale Han**  
**Assessment**

Question	Possible points	Actual points
One	40	_____
Two	40	_____
Three	20	_____
Total	100	_____

**This is a closed book exam and you can have access to a cheat sheet written on front and back. You are not supposed to use the Internet or your phone. Any misconduct will be reported to the Dean's office and it will be dealt with based on university regulations.**

**Question one.** Given table one, table two, and plot one, answer questions a to g. (40 points)

**Definition of variables (data is about UCLA undergrads)**

academicenvp = confidence in academic confidence

classcomfort= uncomfortable, somewhat comfortable, comfortable, very comfortable

welcomingenvp = feeling welcome

- a) Interpret the coefficient for **very comfortable (bolded)** within context. 6 points

Keeping all else constant... (enough to say it once; if they never say it (-1)

On average (-1) the students who find our classroom climate **very comfortable** score 13.88 points higher on academic confidence than those who find our classroom climate **uncomfortable**. No context (-2)

- a) Interpret the coefficient of **welcoming (bolded)** within context. 6 Points

If we increase the feeling of being welcome by one point, on average, academic confidence increases by 0.30 units.

- b) State the question underlying plot one within context. 6 points

Does the effect of class climate on academic confidence vary by feeling of comfort?

OR

Does the effect of climate comfort on academic confidence vary by classroom comfort?

- c) Interpret plot one within context– 6 points

The effect of climate comfort on academic confidence does not very with class comfort in all four conditions of class climate (uncomfortable, somewhat comfortable, comfortable, and very comfortable) as feeling of comfort in our climate increases so does academic confidence.

**e. Interpret R-squared within context. 6 points**

- 23.78% of the variance in academic confidence is explained by class comfort and perception of being welcome in our environment.
- Cannot say predictors in the model because not all are significant.
- Saying significant predictors in the model gets partial credit. (-2)

**f. In multiple linear regression models they generally report MSE. What is MSE a measure of? 5 points**

Either explanation that is complete and thorough gets full credit.

**Conceptual explanation**

MSE or mean square error is the variance of error and it is a measure of error in the model at hand. If you are comparing multiple models, the one with the lower MSE is the better model. It is a measure of the proportion of variance in the outcome variable that we cannot explain.

**Mathematically:**

$$\text{MSE or } S_e^2 = \frac{\sum_{i=1}^N e_i^2}{N - k - 1}$$

$e_i = Y_i - \hat{Y}$  (residual equals actual score minus predicted score)

$$(1 - R^2) = \frac{\text{RSS}}{\text{TSS}}$$

RSS is the sum of square of residuals. The higher the RSS, the lower  $(1 - R^2)$  or the proportion of variance we cannot explain.

**g. If you wanted to find MSE for the linear model, how would you do it? 5 points**

$$\text{MSE or } S_e^2 = \frac{\sum_{i=1}^N e_i^2}{N - k - 1}$$

$$(1-R^2) = \text{RSS/TSS}$$

The output given does not give us all the information we need to calculate MSE

## **Outputs for question one**

### **Relevant Model**

```
> model<-lm(academicenvp~classcomfort*welcomingenvp)  
> summary(model)
```

### **Table one : classcomfort**

uncomfortable	somewhat	comfortable	very comfortable
380	1172	2913	910

### **Table two: Summary table resulting from the model**

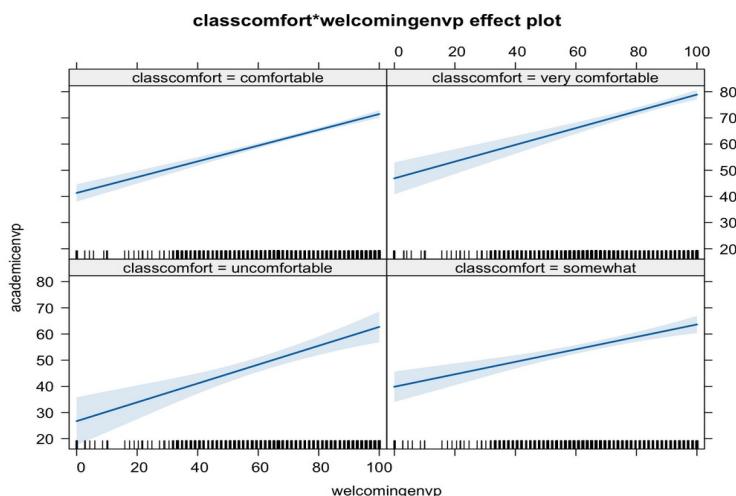
Coefficient	coefficient	Standard error	t -value	Pr(> t )
Intercept	38.70	1.63	23.74	0.000
<b>Very comfortable</b>	<b>13.88</b>	<b>3.81</b>	<b>3.64</b>	<b>0.000</b>
comfortable	-3.78	3.26	-1.16	0.174
Somewhat comfortable	3.52	2.56	1.36	0.174
<b>welcomingenvp</b>	<b>0.30</b>	<b>0.02</b>	<b>13.02</b>	<b>0.000</b>
very comfortable*welcoming	-0.01	0.05	-0.23	0.816
Comfortable*welcoming	0.07	0.07	1.50	0.133
Somewhat*welcomingp	-0.05	0.05	-1.38	0.167

Residual standard error: 13.87 on 1974 degrees of freedom

Multiple R-squared: 0.2783, Adjusted R-squared: 0.2758

F-statistic: 108.8 on 7 and 1974 DF, p-value: < 2.2e-16

**Plot one:** Interaction effect between class comfort and feeling welcome



**Question two.** Given m0, m, table one, table two, table three, plot one, plot two, answer the following questions. **40 points**

### Variables of the study

Divrespectp = feeling of respect for diversity (numerical)

Excluengligh = feeling of exclusion on the basis of spoken English (No, Yes)

Exclurace = feeling of exclusion on the basis of spoken race (No, Yes)

Exclucountry = feeling of exclusion based on the country of origin (No, Yes)

```

> m0<-glm(exclurace~1,family="binomial")
> summary(m0)
Null deviance: 1267.4 on 938 degrees of freedom
Residual deviance: 1267.4 on 938 degrees of freedom
AIC: 1269.4

m1<-
glm(exclurace~divrespectp+excluenglish*exclucountry,family="binomial")
Table one – output resulting from m1
> m1<-
glm(exclurace~divrespectp+excluenglish*exclucountry,family="binomial")
> summary(m1)

```

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
(Intercept)	0.48185	0.30308	1.590	
divrespectp	-0.01802	0.00399	-4.517	
excluenglish1	1.22049	0.21272	5.738	
exclucountry1	0.93199	0.25404	3.669	0.000244 ***
excluenglish1:exclucountry1	-0.06255	0.41573	-0.150	
	0.880396			

Signif. codes: 0 ‘\*\*\*’ 0.001 ‘\*\*’ 0.01 ‘\*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Null deviance: 1267.4 on 938 degrees of freedom

Residual deviance: 1130.3 on 934 degrees of freedom

## Question 2.1

Using m0 and m1, if you were the TA for this class, how would you explain the difference between null residual and model residual. 6 points.

m0 is intercept only model. Null residual is the residual for a model with no predictors.

m1 is a model with four predictors, three of which are statistically significant which cause the null residual to decrease. Model residual is the residual of m2. But, notice that null residual does not change no matter how many significant predictors are in the model.

### **Question 2.2 Given m1:**

- a. What is the research question underlying m1? Please be within context. 5 points**

Can we predict the odds of feeling exclusion on the basis of race from perception of respect for diversity (A), exclusion on the basis of spoken English (B) , country of origin (C), and the combined effect/interaction of B and C.

- b. Interpret the 95% confidence interval of the odds for exclusion on the basis of spoken English WITHIN CONTEXT. (see table two in next page – it is bolded) – 5 points**

We are 95% confident that, the students who feel excluded on the basis of spoken English, the odds of feeling exclusion on the basis of race increases from 2.24 to 5.17.

### **Question 2.3**

- a. If you were to draw the plot of odds, which interval (see table two in next page) would you expect not to include one and why? 5 points**

We would expect the interaction effect not to include the interval because first of all the p-value is higher than 0.05 (0.88) and the interval includes one (0.41 – 2.14).

- b. Interpret 0.84 within context. 5 points**

>  $\exp(-0.01802 * 10)$  – notice that -0.01802 is from table one in previous page (it is bolded)

**[1] 0.84**

Keeping all else constant, if we increase respect for diversity by ten points, the odds of feeling exclusion on the basis of race decrease 16%.

**Table two. Table of odds, 95% confidence interval for odds, and P-value for the coefficient of m1**

Predictor	odd	95% CI for odd	p-value
Respect for diversity	0.98	0.97-0.99	0.000
<b>Exclusion on the basis of spoken English (Yes)</b>	<b>3.39</b>	<b>2.24-5.17</b>	<b>0.000</b>
Exclusion on the basis of country of origin (Yes)	2.54	1.54 -4.19	0.000
Interaction between exclusion based on spoken language and country of origin	0.94	0.41-2.14	0.880

**Table three: The actual and the predicted (based on m1) number of UCLA students who felt exclusion on the basis of race.**

Predicted value	Actual frequency of feeling excluded on the basis of race	
	No	Yes
No	477	213
Yes	82	167

**Question 2.4** Given table three

- a. Compute accuracy of the model. Show your calculations. Find the final answer. 7 points

$$(477 + 167)/(477+167+213+92) = 0.6786$$

- b. Did the model do better with sensitivity or specificity? Choose one. 7 points

Sensitivity \_\_\_\_\_

Specificity \_\_\_\_\_

Explain why?

It did better with specificity because the predicted and actual values for those who do not feel excluded on the basis of race are larger than predicted and actual values for those who feel excluded (no, no = 477, yes, yes = 167)

---

**Question three:** Given the following plot one, output one, and output two, answer the following questions. **20 points**

**Variables in the study:**

Academicenvp = academic confidence (numerical) – **This is the outcome**

Friendlyenvp = friendliness of our environment (numerical)

Overallclimatep = overall UCLA climate (numerical)

Prejudicenvp = feeling of prejudice (numerical)

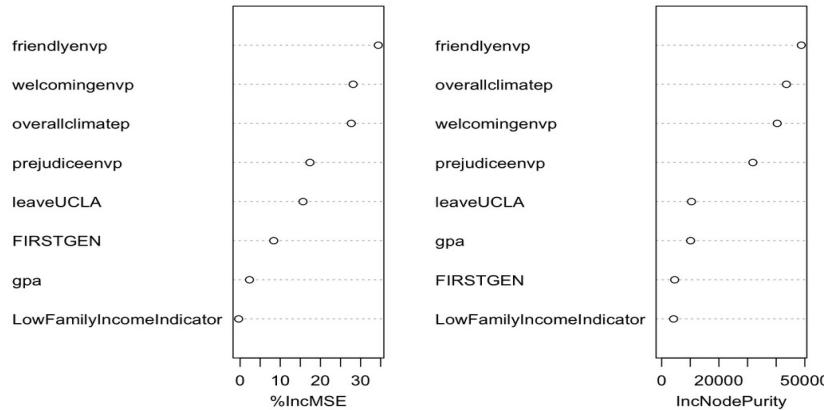
Firtgen = (yes,no)

gpa(categorical – 4 levels)

lowfamilyincomeindicator (Yes,no)

## Plot one

rf



## Model one

> model one<-

```
lm(academicenvp~friendlyenvp+welcomingenvp+overallclimatep+prejudiceenvp
+leaveUCLA+FIRSTGEN+gpa+LowFamilyIncomeIndicator)
```

> summary(m1)

Coefficients:

t )	Estimate	Std. Error	t value	Pr(>
(Intercept)	26.26467	4.50794	5.826	
friendlyenvp	0.18798	0.03772	4.983	
welcomingenvp	0.14510	0.02203	6.586	
overallclimatep	0.24984	0.03106	8.044	1.80e-15 ***
prejudiceenvp	-0.13607	0.03403	-3.999	
leaveUCLAYes	-5.99603	1.01437	-5.911	
FIRSTGENyes	1.49963	0.80724	1.858	
gpa3 - 3.49	0.81395	1.01130	0.805	
0.4210				
gpa3.5 and above	1.26818	1.00601	1.261	
0.2077				

```

gpaBelow 2.49           -1.81451  1.65066 -1.099
          0.2718
LowFamilyIncomeIndicatorNot Low Income      -1.76750  0.77539 -2.279
          0.0228 *
Residual standard error: 13 on 1449 degrees of freedom
Multiple R-squared: 0.3808,   Adjusted R-squared: 0.3765

```

### **Model two**

```

> modeltwo<-
lm(academicenvp~friendlyenvp+welcomingenvp+overallclimatep+prejudiceenvp
+leaveUCLA)
> summary(m6)
Coefficients:

```

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	26.31595	4.44605	5.919	4.04e-09 ***
friendlyenvp	0.18508	0.03783	4.893	1.11e-06 ***
welcomingenvp	0.14032	0.02199	6.381	2.35e-10 ***
overallclimatep	0.25485	0.03111	8.191	5.62e-16 ***
prejudiceenvp	-0.12879	0.03405	-3.783	0.000162 ***
leaveUCLAYes	-6.28320	1.00773	-6.235	5.91e-10 ***

Residual standard error: 13.05 on 1454 degrees of freedom  
 Multiple R-squared: 0.3739, Adjusted R-squared: 0.3717

**a) What does plot one show? 5 points**

The variable importance plot shows the relative importance of predictors that could be included in the model.

**b) What do you conclude from it? 5 points**

The first five seem to be the most important as they create the highest decrease in MSE

**c) If you were the statistician on this project, would you recommend model one or model two? Choose one. 10 points**

**Model one \_\_\_\_\_ Model two \_\_\_\_\_**

I recommend model two

**Give two reasons why you choose one model over model two or model two over model one. (Either of the following reasons is fine)**

1. Fewer predictors (More parsimonious model)
2. Same  $R^2$  as the complicated model.
3. Model one is an example of overfitting; including variables that do not make the model stronger