# CE 264 Problem Set 5: Midterm Review

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#### Problem 1

The probability to move to North Berkeley is:

$$Pr(NB) = \frac{e^{V_{NB}}}{e^{V_{NB}} + e^{V_{SF}} + e^{V_{PO}}}$$
 (since only 3 choices available here) (1)

For the choice-residential model, we have the utility function:

$$U = \beta_{Rent} \times Rent + \beta_{Price} \times Price + \beta_{Size} \times Size + \beta_d \times DummyHouse + \beta_{Log} \times Logsum \quad (2)$$

where most values are listed in the problem, but we still need to compute the logsum from the commuter's choice model.

$$LL = log(\prod Pr_{i,j}) \tag{3}$$

where  $i \in \{1, 2\}$  represents an individual;  $j \in \{1, 2, 3\}$  represents a residence choice.

For a nested logit model:

$$Pr(Driver) = Pr(Driver|Auto) \times Pr(Auto) \times ...$$
 (4)

$$Pr(Auto) = \frac{e^{\mu V_A}}{e^{\mu V_A} + e^{\mu V_N} + e^{\mu V_T}}$$
 (5)

$$Pr(Driver|Auto) = \frac{e^{\mu_A V_D}}{e^{\mu_A V_D} + e^{\mu_A V_P}}$$
 (6)

$$V_A = \frac{1}{\mu_A} log(e^{\mu_A V_D} + e^{\mu_A V_P}) \quad \text{(Similar for } \mu_{NM} \text{ and } \mu_T)$$
 (7)

where  $\mu_A = 1.67$ ,  $\mu_{NM} = 1.205$ , and  $\mu_T = 1.784$ . For each individual in each residential choice, the following utility equations are as follows:

$$V_{Drive} = ASC_{Drive} + \beta_{in-veichle} \times T_{Time} + \beta \times Cost$$
 (8)

$$V_{Passgr} = ASC_{ShareRide} + \beta_{in-veichle} \times T_{Time} + \beta \times Cost$$
(9)

$$V_{Walk} = ASC_{Walk} + \beta_{Walking} \times T_{Time} + \beta \times Cost$$
 (10)

$$V_{Bike} = ASC_{Bike} + \beta_{Bike} \times T_{Time} + \beta \times Cost \tag{11}$$

$$V_{W-T} = ASC_{W-T} + \beta_{in-veichle} \times T_{Time} + \beta_{Wait} \times T_{Wait} + \beta_{Transit} \times T_{Transit} + \beta \times Cost \quad (12)$$

$$V_{A-T} = ASC_{D-T} + \beta_{in-veichle} \times T_{Time} + \beta_{Wait} \times T_{Wait} + \beta_{Transit} \times T_{Transit} + \beta \times Cost \quad (13)$$

The upper level utilities are computed in Table 1.

Table 1: Upper level utilities

Table 1: Upper level utilities    ASC-BIKE   ASC-DA   ASC-DT   ASC-SR   ASC-WIT   ASC-W   IVIT   B   WALKING TIME   WIFTS   WIT   TC   mu															
	ASC-BIKE	ASC-DA	ASC-DT	ASC-SR	ASC-WTT	ASC-W		В	WALKING TIME	WTFTS	WTT	TC		mu	
DA		0					-0.032	-0.059	-0.028	-0.062	-0.017	-0.092		1.67	
SR				-1.31			-0.032	-0.059	-0.028	-0.062	-0.017	-0.092		1.205	
W						-0.726	-0.032	-0.059	-0.028	-0.062	-0.017	-0.092		1.784	
В	-2.19						-0.032	-0.059	-0.028	-0.062	-0.017	-0.092			
WTT					0.558		-0.032	-0.059	-0.028	-0.062	-0.017	-0.092			
DT			-0.701				-0.032	-0.059	-0.028	-0.062	-0.017	-0.092			
individual1 md													V	V-scaled	V_upperlevel
DA		0					21		5			10	-1.732	-2.89244	-1.561761997
SR				-1.31			21		5			3	-2.398	-4.00466	
W						-0.726	0		60			0	-2.406	-2.89923	-2.193714195
В	-2.19						0	21				0	-3.429	-4.131945	
WTT					0.558		9		9	2		1.75	-0.267	-0.476328	0.270784808
DT			-0.701										0	0	
individual1 nb															
DA		0					32		5			10	-2.084	-3.48028	-1.924820275
SR			i	-1.31			32		5		1	3.5	-2.796	-4.66932	
W						-0.726							-0.726	-0.87483	-0.594758294
В	-2.19												-2.19	-2.63895	
WTT					0.558		28		5	5	4	5.65	-1.3758	-2.4544272	-1.305896153
DT			-0.701				32		2	4		5.2	-2.5074	-4.4732016	
individual1 po															
DA		0					19		5			9	-1.576	-2.63192	-1.427246249
SR				-1.31			19		5			3		-3.89778	
W						-0.726							-0.726	-0.87483	-0.594758294
В	-2.19												-2.19	-2.63895	
WTT					0.558		29		8	5	4	5.1	-1.4412	-2.5711008	-1.329785859
DT			-0.701				24		7			4.1	-2.2902	-4.0857168	
individual2 md															
DA		0					49		5			7.5	-2.398	-4.00466	-2.268305361
SR				-1.31			49		5			2.5	-3.248	-5.42416	
W						-0.726							-0.726	-0.87483	-0.594758294
В	-2.19												-2.19	-2.63895	
WTT					0.558		28		15	5		3.75	-1.413	-2.520792	-0.562287013
DT			-0.701										-0.701	-1.250584	
individual2 nb															
DA		0	İ				3		5			1.5	-0.374	-0.62458	-0.300390218
SR				-1.31			3		5			0.5	-1.592	-2.65864	
W			İ			-0.726			12				-1.062	-1.27971	-0.915356791
В	-2.19							4					-2.426	-2.92333	
WTT			İ		0.558		3		5	5		2	-0.172	-0.306848	0.309106926
DT			-0.701										0	0	
individual2 po															
DA		0	İ				18		5			4.2	-1.1024	-1.841008	-1.008465372
SR			i	-1.31			18		5		1	1.5	-2.164	-3.61388	
W			İ			-0.726							0	0	0.00490886
В	-2.19		İ					35	0				-4.255	-5.127275	
WTT			İ		0.558		27		6		14	4.05	-1.3946	-2.4879664	
DT			-0.701				25		15		-	3.1	-2.4542	-4.3782928	

Using these 12 computed upper level utilities, the following results can be derived:

$$\tilde{V}_{MD,Auto} = log(e^{-1.562} + e^{-2.268}) = -1.161$$
(14)

$$\tilde{V}_{MD,Non} = log(e^{-2.914} + e^{-0.595}) = -0.411$$
(15)

$$\tilde{V}_{MD,Tran} = log(e^{0.271} + e^{-0.562}) = 0.632$$
(16)

$$\tilde{V}_{NB,Auto} = log(e^{-1.925} + e^{-0.300}) = -0.121$$
(17)

$$\tilde{V}_{NB,Non} = \log(e^{-0.595} + e^{-0.915}) = -0.049 \tag{18}$$

$$\tilde{V}_{NB,Tran} = log(e^{-1.306} + e^{0.309}) = 0.491$$
(19)

$$\tilde{V}_{PO,Auto} = log(e^{-1.427} + e^{-1.008}) = -0.503$$
(20)

$$\tilde{V}_{PO,Non} = log(e^{-0.595} + e^{0.005}) = 0.443$$
(21)

$$\tilde{V}_{PO,Tran} = log(e^{-1.330} + e^{-1.316}) = -0.630$$
(22)

Now, let's compute the logsum for each residential choice:

$$\tilde{V}_{MD} = log(e^{-1.161} + e^{-0.411} + e^{0.632}) = 2.858$$
(23)

$$\tilde{V}_{NB} = log(e^{-0.121} + e^{-0.049} + e^{0.491}) = 3.472$$
(24)

$$\tilde{V}_{PO} = log(e^{-0.503} + e^{0.443} + e^{-0.630}) = 2.695$$
(25)

Hence, the utility for each residential choice can be derived:

$$V_{MD} = -0.16 \times 29 - 0.064 \times 70 + 4.400 \times 0.82 - 0.782 \times 0 + 2.000 \times 2.858 = 0.204$$
 (26)

$$V_{NB} = -0.16 \times 28 - 0.064 \times 60 + 4.400 \times 1.16 - 0.782 \times 1 + 2.00 \times 3.472 = 2.946 \tag{27}$$

$$V_{PO} = -0.16 \times 18 - 0.064 \times 82 + 4.400 \times 1.26 - 0.782 \times 1 + 2.000 \times 2.695 = 2.024 \tag{28}$$

Plug the above equations into Equation (1), and the final result is obtained:

$$Pr(NB) = \frac{e^{2.946}}{e^{0.204} + e^{2.946} + e^{2.024}} = \mathbf{0.684}$$
 (29)

### Problem 2

(A)

$$Pr(P|G=1) = \frac{e^0}{e^{(0.3+1.8)} + e^1 + e^0} = 0.084$$
(30)

$$Pr(M|G=1) = \frac{(0.3+1.8)}{e^{(0.3+1.8)} + e^1 + e^0} = 0.687$$
(31)

$$Pr(T|G=0) = \frac{e^1}{e^{0.3} + e^1 + e^0} = 0.536$$
 (32)

$$Pr(T|G=0) = \frac{e^0.3}{e^{0.3} + e^1 + e^0} = 0.266$$
(33)

$$LL = log(0.084^{2} \times 0.687^{4} \times 0.536^{6} \times 0.266^{2}) = -12.8$$
(34)

Hence, the value of the log-likelihood function at MLE is -12.8.

(B) 
$$\rho^2 = 1 - \frac{L(\beta)}{L(0)} = 1 - \frac{-12.8}{14 \times \log(\frac{1}{3})} = 1 - \frac{-12.8}{-15.4} = \mathbf{0.17}$$
 (35)

(C)

Yes, since now if we check the table of estimated parameters, we noticed given that  $\beta_{3T} = \beta_{3P} = 0$ , the graduate students' choice will always be M, which in fact makes  $\beta_S$  not estimable. Hence, changing the availability like this would definitely affect the value of MLE.

### Problem 3

(A)

**Yes.** Travel time is a variable across alternatives, so it can be included in all alternatives and four parameters can be estimable. In this example, the parameter values are partially constrained to be the same across motor and nonmotor alternatives.

(B)

No. Because the distance between home and destination for each staff is fixed and does not vary across alternatives. To modify the specification, estimated alternative-specific distance parameters and one base alternative can be used to replace a single beta for all four alternatives.

(C)

**No.** Because the average price per gallon is a fixed value for all respondents, which means it is perfectly correlated with the car constant. It can be modified to fuel cost per trip based on trip distances to estimate the parameter.

(D)

**Yes.** Female = 1 Male. This variable does not vary across alternatives and it is categorical with two categories. So, one utility and one category must be the base and gender can be included in at most 3 alternatives.

 $(\mathbf{E})$ 

No, at most 2 variables can be included in each utility. So, one of the income categories need to be set as a base and drop from utility.

# Problem 4

(A)

Because t-test=  $\frac{\hat{\beta}-0}{\bar{\sigma}}$ ,

$$\bar{\sigma} = \frac{\hat{\beta} - 0}{t - test} = \frac{0.8}{8.52} = 0.094 \tag{36}$$

Then we let  $\alpha$  walk-transit for Transit Nest to de a hypothesis test:

$$H_0: \quad \alpha = 1$$
  
 $H_1: \quad \alpha \neq 1$   
 $t\text{-}test = \quad \frac{0.8-1}{0.094} = -2.128 < -2.1$  (37)

Thus we **reject** the null hypothesis, and the cross situation is preferred.

(B)

For unrestricted model, we can estimate much more parameters than restricted models. Thus, the likelihood and  $\rho^2$  will increase, and we cannot confirm what happens to  $\rho^2$ .