Tutorial Customer Choice (Logit)

DON'T I FORGET.

Marketing Engineering for Excel is a *Microsoft Excel* add-in. The software runs from within Microsoft Excel and only with data contained in an Excel spreadsheet.

After installing the software, simply open *Microsoft Excel*. A new menu appears, called "*ME* \rightarrow *XL*." This tutorial refers to the "*ME* \rightarrow *XL*/*Customer Choice* (*Logit*)" submenu.

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	Customer Choice (Logit)	►
	Customer Lifetime Value	►
	GE Portfolio Matrix	►
	Positioning	►
	Resource Allocation	►
	Segmentation and Classification	►
< <u>.</u>	Getting Started (PDF)	
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Overview

The customer choice (logit) model is an individual-level response model that helps analyze and explain the choices individual customers make in a market. The customer choice model helps firms understand the extent to which factors such as the price of a brand or its ease of installation influence a customer's choice. A brand's purchase probability at the individual level can be aggregated to determine the brand's market share at the market level.

Firms also can use customer choice analysis to develop marketing programs tailored to specific market segments, or even to individual customers.

Further, if a company has purchase data about its products versus those of its competitors (product choice data), as well as some observed independent variables (e.g., gender, price, promotion), it can use customer choice modeling to answer such questions as:

- ✓ Does a customer's gender influence his or her purchase decision regarding our product(s)?
- ✓ Do competitor's promotions affect the purchase of our product(s)?
- ✓ How do our promotions affect our sales rates?

Getting Started

Customer choice analysis allows you to use your own data directly or to use a preformatted template.

Because customer choice models require a specific data format, users with their own data should to review the preformatted template to learn about the appropriate structure.



This section explains how to create an easy-to-use template to enter your own data.

If you want to run customer choice analysis immediately, open the example file "*OfficeStar Data (Customer Choice).xls*" and jump to "Step 2: Running analysis." By default, the example files install in "*My Documents/My Marketing Engineering/*."

Step 1 Creating a template

Using the interactive assistant

In Excel, if you click on ME \triangleright XL \rightarrow CUSTOMER CHOICE (LOGIT) \rightarrow CREATE TEMPLATE, a dialog box will appear. This box represents the first step in creating a template for running the customer choice model. The first dialog box prompts you to use the interactive assistant.

Marketing Engineering for Excel models allow you to use the interactive assistant, which will prompt you to enter the parameters required by the model and build a template spreadsheet for you to enter the required data. This generated template includes pre-selected cell ranges that correspond to the parameters you enter. We recommend that you use Marketing Engineering for Excel templates to simplify subsequent analyses.

Expert users who are familiar with Marketing Engineering for Excel models and data requirements may prefer to input data directly in an unformatted spreadsheet. Such users should begin with the interactive assistant to become familiar with the data format that Marketing Engineering for Excel expects.

Unless you are already familiar with the methodology, you should select "yes" in response to the box that asks whether you want to use the interactive assistant.

🍱 Choose Customer Choi ? 🔀									
Please select how you would like to create the Customer Choice Template.									
Interactive Assistant									
Would you like to use the Interactive Assistant to create a Customer Choice Template									
Yes									
C No (recommended for expert users only)									
Cancel Next >									

With the interactive assistant, the following dialog box allows you to create a template to run the customer choice software. All customer choice models require at least one case per respondent (customer) and at least one independent variable.

🏧 Create Customer Choi ? 🔀								
Please select the options to create the Customer Choice template.								
Options								
Number of respondents	20 🕂							
Number of cases per respondent	-							
Number of independent variables	5 🕂							
Cancel < <u>Pr</u> evious	<u>N</u> ext >							

The options are as follows:

- **Number of respondents:** The total number of respondents (customers) in your study.
- **Number of cases per respondent:** The number of observations per respondent (one or more than one purchase event).
- **Number of independent variables:** The number of independent variables you collected or observed during the study, such as respondent gender, product on sale, and so forth.

After completing the dialog box, click Next to move to the subsequent dialog box and define the customer choice template further.

🏧 Create Customer Choi ? 🔀								
Please select whether the analysis will be performed on one or multiple alternatives.								
Number of alternatives								
One alternative (e.g., buy or not buy)								
C Multiple alternatives (e.g., buy one out of many)								
Alternatives								
Enter new Alternative Label:								
Add								
List of Alternatives								
Up Down Delete								
Cancel < <u>P</u> revious <u>O</u> K								

There are two types of data that can be used in customer choice analysis:

- **One alternative** (Binary choice model). This data format is suitable when customers have two choice alternatives, such as a choice between "buy" and "don't buy." That is, it requires a yes-no decision process.
- Multiple alternatives (Multinomial choice model). This data format considers customer choices across a subset of related competitors, such as brands A, B, and C. Therefore, it requires a one-out-of-many decision process.

If you select the multiple alternatives option, you will activate the lower portion of the dialog box, which allows you to enter the labels you want to use to describe the various alternatives. In the box labeled "Enter new Alternative Label," enter the label for the first alternative, then click the Add button. The alternative label appears in the list, as shown below:

🛯 Create Customer Choi ? 🔀								
Please select whether the analysis will be performed on one or multiple alternatives.								
Number of alternatives								
C One alternative (e.g., but or not but)								
Multiple alternatives (e.g., buy on hor buy) Multiple alternatives (e.g., buy one out of manu)								
 Malaple alternatives (e.g., bdy one out or many) 								
Alternatives								
Enter new Alternative Label:								
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List of Alternatives								
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Repeat the process of adding options until you have entered all the desired labels. You may use the Up, Down, or Delete buttons to modify your list by simply selecting any item within the list.

If you specified the "Single alternative" model, the labels will automatically be designated as "Response" (when the alternative is chosen) and "Dummy" (when the alternative is not chosen).



If your data require a "no choice" option, you may specify it yourself. If you do not specify a label for the no-choice option, the software will add this option automatically during the analysis.

For example, if customers must choose among three brands, A, B, and C, and some choose none of the options, the choice process actually involves four options (A, B, C, and none). The software identifies this issue and adds the fourth option (called a dummy) automatically. Alternatively, you may specify the four options manually.

After entering all the alternatives, click OK to generate the data collection template, as shown below:

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Not using the interactive assistant

If you decide not to use the interactive assistant, the following dialog box appears:

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Please select the options to create the Customer Choice Template.									
Options									
Number of respondents 20									
Number of cases per respondent	1 🕂								
Number of independent variables	5 🕂								
Number of alternatives	β 🛨								
(e.g., set number of alternatives to 1 fo No buy decision; or to 3 for a Buy A vs Buy C decision)	ra Buyvs. . BuyBvs.								
Cancel < Previous	<u>0</u> K								

You should use the Marketing Engineering for Excel templates whenever possible; for example, the preceding dialog box allows you to specify the parameters to use to build your template, but you must fill in the resultant generated spreadsheet manually.

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	Enter id 1 here	Enter	Enter	Enter													
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Step 2 Entering your data



In this tutorial, we use the example file "OfficeStar Data (Customer Choice).xls," which by default appears in "My Documents/My Marketing Engineering/."

To view a proper data format, open that spreadsheet in Excel. A snapshot is reproduced below.

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	Respondent 2	OfficeStar	1	0	3	2	5	6	1							
		Paper & Co	0	0	7	4	6	7								
		Office Equip'nt	0	0	5	5	5	7								
	Respondent 3	OfficeStar	1	0	3	3	3	6								
		Paper & Co	0	0	7	2	1	1								
		Office Equip'nt	0	0	5	2	1	7								
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		Paper & Co	0	0	4	3	3	6	1							
		Office Equip'nt	0	0	1	4	4	1	1							
	Respondent 10	OfficeStar	1	0	3	2	3	2								
		Paper & Co	0	0	7	3	1	4	1							
		Office Equip'nt	0	0	1	5	5	1								
	Respondent 11	OfficeStar	0	0	2	2	3	3	i							
		Paper & Co	1	5	3	2	6	3								
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		Paper & Co	0	0	2	6	3	3	i							
		Office Equip'nt	1	8	5	5	3	6								
	Respondent 13	OfficeStar	1	0	2	5	1	3								_
		Paper & Co	0	0	3	2	5	6								
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	Respondent 15	UtticeStar	1	U 0												
		Paper & U0	0		1	6	4	2					-			-
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For each respondent, a customer choice spreadsheet contains:

- Alternative names for each product in the study. If the spreadsheet was generated using the single alternative option, this column is not present.
- Cases. The same customer might have been exposed to the same choice situation, repeatedly, and these repetitions assist model estimation. If the spreadsheet was generated using the one case per respondent option, this column is not present.
- Choice variables. The alternative the customer chose receives a value of 1; all other alternatives receive values of 0. Only one "1" can exist per case. If all options are set to 0, a none-of-the-above option (dummy) is automatically inserted during the analysis.
- Independent variables. A column represents each variable specified for the study, and all independent variables should have consistent value ranges. That is, the data for a single independent variable should be scaled within the same range. Independent variables can take on discrete values if they are appropriately specified using dummy-variable coding.

Step 3 Running analyses

After you enter your data in an Excel spreadsheet with the appropriate format, click on ME>XL \rightarrow CUSTOMER CHOICE (LOGIT) \rightarrow RUN ANALYSIS. The dialog box that appears allows you to set the options to perform the customer choice analysis of your data.

The four sections in this dialog box control the customer choice analysis.

ME Customer Choice Analysis										
Please select options for Customer Choice										
Data										
✓ First column contains respondents' ids										
More than 1 case per respondent										
More than 1 alternative per case										
Generate alternative-specific constants										
Significance level (%): 5										
Perform analysis on holdout sample										
C As a percentage of dataset (%) 10 🛨										
C Last case of each respondent										
Latent Class Options										
Maximum number of segments in										
- Novt Stone										
Next you will be asked to select Cell Bange for										
Customer Choice Data.										
Save choices in current spreadsheet										
Advanced > Cancel Next >										

Data

In this portion of the dialog box, you must indicate which data are present in the spreadsheet. If you have used the interactive assistant, the software automatically clicks the appropriate check boxes. If you are using a custom spreadsheet, you will need to select the appropriate check boxes to indicate which data are present.

Generate Alternative-Specific Constants. In general, it is a good idea to include alternative-specific constants in the model. If you check this option, the program will automatically generate the dummy variables for alternative-specific constants. For estimation purposes, the last listed alternative in the data is set to the base value of 0. The alternativespecific constants for the other alternatives are estimated with respect to this base.

- **Significance level.** Expressed in percentage terms, this option refers to the significance level of the statistical tests. The software uses this value to identify statistically significant coefficients from the analysis.
- Perform analysis on holdout sample. This option allows you to specify a number between 0 and 100 (0 is the default) to represent the percentage of the data you want to use as a holdout sample to assess the predictive validity of the model. If you choose this option, the customer choice analysis selects the closest feasible sample with a size equal to, or smaller than, the percentage you specify. For example, if you have 110 customers (cases) with one observation per customer and you specify 15%, the program sets aside the last 16 observations in the data file as the holdout sample and estimate the model using the first 94 customers.

Latent Class Options

In this portion of the dialog box, you may indicate the maximum number of segments which ME►XL should consider. The default number of segments is set to 1 which is the most common option. If you have reason to believe your data may have multiple "latent" segments, you may select a number greater than 1. In the step that follows, you will be able to review the attributes of each segment and decide how many segments to include in the analysis.

Note that for the latent class analysis to be executed, you need a sufficient number of respondents, so that even small segments, if they occur (say a segment that is about 5% of your sample), will still have a reasonable number of respondents in that segment (say 20 or more respondents). Note: The OfficeStar example used for this tutorial does <u>not</u> include the data necessary to use the Latent Class option.

Advanced Menu

When using the Latent Class option, it may be necessary to further control the evaluation criteria from the normal software defaults. Clicking the Advanced button will produce the following expanded dialog box:

Customer Choice Analysis	? <mark>x</mark>
Please select options for Customer Choice	7
✓ First column contains respondents' ids ☐ More than 1 case per respondent	
✓ More than 1 alternative per case	
Generate alternative-specific constants	
Options	Latent Class Estimation Options
Significance level (%) : 5	
Perform analysis on holdout sample	E steps 30 -
C As a percentage of dataset (%)	M steps 1500
C Last case of each respondent	Log Likelihood tolerance 0.001000000000 📩
Latent Class Ontions	Gradient tolerance 0.001000000000 -
Maximum number of segments in 1	Parameter tolerance 0.0001000000000
analysis	Objective tolerance
Next Steps Next, you will be asked to select Cell Range for Customer Choice Data.	Number of runs 1
Save choices in current spreadsheet	
< Advanced Cancel Next >	

Latent Class Estimation Options

Latent Class analysis is implemented in ME►XL via the EM algorithm. EM (Expectation Maximization) is an iterative technique in which, in each iteration, the procedure predicts the unobserved latent classes (in the E-step) and based on these predictions re-estimates the parameters (in the M-step). The controls below allow user to influence the execution of the program. Typically the tolerance levels can be 0.001. The program uses several criteria to evaluate whether to terminate, including how fast the likelihood function is converging, and how fast the coefficients of the model are converging.

E steps: Specifies the number of expectation steps.

M steps: Specifies the number of maximization steps.

Log Likelihood, Gradient, Parameter and Objective Tolerances: These parameters control the tolerances within the analysis. If a data set is not converging, the user should increase the tolerance levels to gain better insight about the data. Note that decreasing tolerance levels will increase the required processing time.

Multiple Runs?: In many cases, it will be necessary to make multiple runs of the same data to determine whether a true latent class exists. This parameter will allow you to re-run the model "n" times, and select the best results from those runs.

After selecting the desired options, click Next. The software will ask you to select the data on which to perform the analysis.



Optional Screen if Latent Class Option was Selected

If you changed the number of segments in Latent Class Options to greater than 1, the following dialog box will appear. With this dialog box, you can review the diagnostic properties associated with each number of segments, up to the maximum number of segments you specified. Use the drop down arrow to select segment scheme to be displayed. In the two sections of the screen, use the scroll arrows to view all of the coefficient estimates for each segment. The bottom part of this screen allows you to select how many segments you wish to retain for analysis. Note: Latent Class will identify potential clusters (segments). Numerous runs may be required before one can establish clusters of importance.

Results			
Select segmentat Parameter(Coeffi	ion scheme for display icient) Estimates	3-segment case 💌	
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Coefficient AT-1	Estimate 0.4925	t-statistic 12.8445	• •
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Number of segmer	uts to retain for further	analysis 3 OK	

Step 4 Interpreting the results

The generated workbook contains several worksheets that describe the analysis.

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6	Paper & Co	0.900	3.750	3.600	4.250	4.350												
7	Office Equip'nt	0.800	3.900	4.400	3.500	4.050												
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23	OfficeStar	10	1	1														
24	Paper & Co	0	1	0														
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Variable Averages

This portion of the spreadsheet presents the means of each independent variable for the group of respondents.

Variable Averages for Chosen Alternatives

This portion of the spreadsheet presents the means of each independent variable where that alternative was the chosen alternative.

Confusion Matrix on Estimation Sample

The confusion matrix portion of the spreadsheet includes two matrices: numerical counts and percentages for the same data.

The diagonal of both matrices appears bolded, to highlight the convergence of the observed and predicted data. A high value or percentage at this diagonal intersection represents a high correlation between observed and predicted behavior.

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	А	В	С	D	E	F	G	Н	I	J
1										
2		Coefficient Esti	mates	[segme	ent 1]					
3		Coefficient estimates o	f the Choi	ce model.	Coefficier	nts in bold	are statist	tically sign	ificant.	
4		Variables / Coefficient estimates	Coefficien t estimates	Standard deviation	t-statistic					
5		Past purchases	0.863569	0.359493	2.402184					
6		Expensive	-0.81508	0.383513	-2.12529					
7		Convenient	0.537433	0.373534	1.438779					
8		Service	0.166118	0.255744	0.649551					
9		Large choice	0.4312	0.32222	1.338216					
10		Const-1	4.391705	1.933972	2.270821					
11		Const-2	3.600351	1.805345	1.994273					
12		Baseline		n/a	n/a					
13										
14										
15		Elasticities [seg	gment	1]						
16		Elasticities of coefficie	nts							
17		Elasticities of Past purchases	OfficeStar	Paper & Co	Office Equip'nt					
18		OfficeStar	0	0	0					
19		Paper & Co	-0.06699	0.084338	-0.00238					
20		Office Equip'nt	-0.14645	-0.1145	1.190273					
21										
22		Elasticities of Expensive	OfficeStar	Paper & Co	Office Equip'nt					
4 4	•	M \ Diagnosis \Segment	I A Estimatio	in_/						

Coefficient Estimates

This portion of the spreadsheet shows the coefficients associated with each independent variable. Coefficients that are significantly different from 0 (at the level of significance specified during the Run Analysis set up) appear in **bold**; they are in green when positive (positive influence on the likelihood of choice) and in **red** when negative.

In the OfficeStar example, *past purchases* has a positive influence on the likelihood of choice (a customer is more likely to return to a store that he or she has patronized in the past), whereas *expensive* has a negative impact (people who perceive a store as expensive avoid it).

Elasticities

This portion reveals the elasticities of each independent variable in the study. The matrix provides information about the elasticity of impact that each variable has on choice shares. For a 1% change in an attribute in a given row, the elasticity equals the percentage change expected in the response to that alternative. Large values mean that changes in the variable represented in that row have significant effects on the choice probabilities of the choice alternatives in a specific column. The bolded cells on the diagonal indicate the effect of a product change on that product, whereas the off-diagonal cells reflect the effects of the same product change on a competitor's product.

In the OfficeStar example, service elasticity (.14) is rather small (compared with other elasticities that appear in the diagonal of each elasticity matrix), so improving perceptions of service quality by 1% would have a limited impact on the likelihood of customer purchase from OfficeStar (i.e., .14%). However, the greater service elasticity for a competitor, Office Equipment (.42), suggests that this competitor would benefit much more than OfficeStar if it managed to improve customers' perceptions of its service quality. The off-diagonal elements represent cross-elasticities.

The off-diagonal elements reveal the influence on competitors created by changes in customer perceptions.

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A	в	C	D	E	F	G	Н		J	K	L	M	N	0	F
1	1														
2	Estimation San	nple De	tails												
3	Choice probabilities, p	oredicted a	ind observ	ed choice:	s, segmen	t members	hip proba	bilities and	predicte	l segment	for the sar	nple used	to estimat	e the mod	lel.
4	Respondents / Choice probabilities	OfficeStar probability	Paper & Co probability	Office Equip'nt probability	Predicted OfficeStar	Predicted Paper & Co	Predicted Office Equip'nt	Observed OfficeStar	Observed Paper & Co	Observed Office Equip'nt					
5	Respondent 1	0.628	0.353	0.020	1	0	0	0	0	1					
6	Respondent 2	0.900	0.083	0.017	1	0	0	1	0	0					
7	Respondent 3	0.998	0.001	0.002	1	0	0	1	0	0					
8	Respondent 4	0.015	0.985	0.000	0	1	0	0	1	0					
9	Respondent 5	0.040	0.960	0.000	0	1	0	0	1	0					
10	Respondent 6	0.506	0.491	0.003	1	0	0	1	0	0					
11	Respondent 7	0.251	0.388	0.361	0	1	0	0	1	0					
12	Respondent 8	0.982	0.018	0.000	1	0	0	1	0	0					
13	Respondent 9	0.637	0.338	0.025	1	0	0	1	0	0					
14	Respondent 10	0.748	0.038	0.215	1	0	0	1	0	0					
15	Respondent 11	0.039	0.960	0.001	0	1	0	0	1	0					
16	Respondent 12	0.009	0.164	0.827	0	0	1	0	0	1					
17	Respondent 13	0.779	0.221	0.000	1	0	0	1	0	0					
18	Respondent 14	0.955	0.042	0.003	1	0	0	1	0	0					
19	Respondent 15	0.719	0.000	0.281	1	0	0	1	0	0					
20	Respondent 16	0.669	0.322	0.009	1	0	0	0	1	0					
21	Respondent 17	0.088	0.904	0.008	0	1	0	0	1	0					
22	Respondent 18	0.879	0.117	0.004	1	0	0	1	0	0					
23	Respondent 19	0.051	0.725	0.224	0	1	0	0	1	0					
14 4 3	H Diagnosis / Segment 1	Estimati	on/	0.000		4	· · · ·	· · ·	1 4	lu ^	1				

Estimated Choice Probabilities

This portion of the above spreadsheet shows the probabilities of segment membership in each segment, the choice alternative that the model predicts will be chosen by that respondent, and the observed choice for each respondent in your study. The matrix will show all respondents unless you selected the "Perform analysis on holdout sample" option. In this case, this matrix shows only the results for the holdout sample.

Step 4a Interpreting the results when using Latent Class option

When using the Latent Class option, several screens will differ from those produced when not using the Latent Class option. Notably, a worksheet will be produced for each segment analyzed, as shown below.

Note: The OfficeStar example used for this tutorial does \underline{not} include the data necessary to use the Latent Class option.

А	В	С	D	E	F	G	Н	I
	Coefficient Esti	imates	[segme	ent 1]				
	Coefficient estimates o	of the Choi	ce model.	Coefficie	nts in bold	are statis	tically sign	ificant.
	Variables / Coefficient estimates	Coefficien t estimates	Standard deviation	t-statistic				
	AT-1	0.498501	0.035037	14.22771				
	AT-2	0.536074	0.035696	15.01794				
	AT-3	-1.02803	0.057895	-17.7568				
	Baseline		n/a	n/a				
•	▶ Diagnosis Segment	1 / Segment	2 / Hold-ou	it / Segme	nt Membershi	р /	1	

The Hold-out worksheet will show the details of the analysis for the hold-out sample.



Latent Class analysis also produces an additional worksheet, Segment Membership, as shown below. The segment membership will show the probability of each respondent belonging to each segment, along with the predicted segment to which the respondent will belong (this is the segment to which a respondent has the highest probability of belonging).

	A	В	С	D	E	F	G	Н	1	J	K	L
1												
2	Γ.	Sample Segme	nt Ass	ianmer	ts							
3		Seament membership	probabilit	ies and pr	edicted se	ament for	the sampl	e used to i	estimate th	ne model.		
_		Respondents / Choice probabilities	Segment 1	Segment 2	Segment 3	Predicted segment						
4			probability	probability	probability							
5		1001	0.449434	0.286537	0.264029	1						
6		1002	0.463221	0.27542	0.26136	1						
7		1003	0.477495	0.263769	0.258736	1						
8		1004	0.443717	0.295419	0.260864	1						
9		1005	0.443433	0.287829	0.268739	1						
10		1006	0.485676	0.254792	0.259533	1						
11		1007	0.440196	0.295463	0.264341	1						
12		1008	0.506788	0.245776	0.247437	1						
13		1009	0.433779	0.311099	0.255123	1						
14		1010	0.419407	0.322026	0.258566	1						
15		1011	0.471711	0.266453	0.261836	1						
16		1012	0.49709	0.248123	0.254787	1						
17		1013	0.509531	0.241164	0.249305	1						
18		1014	0.492029	0.248617	0.259354	1						
19		1015	0.527933	0.227627	0.24444	1						
20		1016	0.477754	0.269379	0.252867	1						
21		1017	0.534808	0.226752	0.238439	1						
22		1018	0.445592	0.29189	0.262518	1						
23		1019	0.530161	0.226284	0.243555	1						
24		1020	0.511429	0.239779	0.248792	1						
25		1021	0.494155	0.256925	0.24892	1						
26		1022	0.485009	0.260995	0.253996	1						
27		1023	0.486545	0.256327	0.257128	1						
28		1024	0.490264	0.251825	0.257911	1						
29		1025	0.507323	0.245191	0.247486	1		_				
I4 4	Þ	► N Diagnosis / Segment 1	/ Segment	2 / Segme	nt 3 🖌 Estim	ation \Seg i	ment Memb	ership /				4

If you requested analysis on a holdout sample, the Segment Membership tab will show the results for the holdout population only, as shown below.

Segment membership	probabilit	ies and pr	edicted se	gment for	the hold-o	ut sampl
Respondents / Choice probabilities	Segment 1 probability	Segment 2 probability	Segment 3 probability	Predicted segment		
1001	0.001479	0.098425	9.59E-05	2		
1002	2.37E-05	0.099963	1.37E-05	2		
1003	5.54E-05	0.099724	0.00022	2		
1004	0.027876	0.072114	9.43E-06	2		
1005	0.048897	0.050652	0.000451	2		
1006	0.021553	0.078146	0.0003	2		
1007	0.001727	0.098272	1.69E-06	2		
1008	6.42E-05	0.099495	0.00044	2		
1009	9.47E-05	0.097762	0.002143	2		
1010	0.000144	0.097492	0.002364	2		
1011	0.033317	0.066677	5.69E-06	2		
1012	5.3E-06	0.083795	0.0162	2		
1013	0.001331	0.098528	0.000141	2		
1014	1.58E-05	0.064687	0.035297	2		
1015	7.32E-07	0.031227	0.068773	3		
1016	0.000577	0.099327	9.66E-05	2		
1017	0.000205	0.060501	0.039294	2		
1018	1.66E-05	0.099881	0.000102	2		
1019	3.93E-05	0.099926	3.47E-05	2		
1020	8.53E-05	0.098199	0.001716	2		
1021	2.84E-05	0.099711	0.00026	2		
1022	3.19E-06	0.021146	0.078851	3		
1023	5.25E-05	0.070382	0.029565	2		
1024	3.5E-05	0.097601	0.002365	2		