

Bringing energy to your door

NIA ENWL010 Value of Lost Load to Customers

Technical Appendices

5 October 2018



VERSION HISTORY

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GLOSSARY

Abbreviation	Term
СВС	Choice-based conjoint
CE	Choice experiment
CV	Contingency valuation
DECC	Department of Energy and Climate Change
DNO	Distribution network operator
DSR	Demand side response
ECP	Engaged customer panel
EV	Electric vehicle
GB	Great Britain
НВ	Hierarchical Bayesian
I&C	Industrial and commercial
LCN Fund	Low Carbon Networks Fund
LCT	Low carbon technology
LE	London Economics
MNL	Multinomial Logit
NIA	Network Innovation Allowance
NPV	Net present value
Ofgem	Office of Gas and Electricity Markets
OLS	Ordinary least squares
RIIO-ED1	Electricity distribution price control 2015 to 2023
SME	Small to medium enterprise
SPSS	Statistical package for the social sciences (software package used for advanced statistical analysis)
SSI	Survey Sampling International
VoLL	Value of Lost Load
WTA	Willingness to accept
WTP	Willingness to pay

1 THE CHOICE EXPERIMENT

1.1 Why use a choice experiment?

Where feasible, macro-economic approaches have been used to derive a figure for VoLL indirectly. These comprise calculations of the actual costs incurred by customers as a result of supply interruptions, either in the form of actual monetary losses or as revealed in the way people respond (eg by running generators, paying for substitutions or repairs to damaged appliances). The main shortcomings of these approaches are that they are either too simplistic or the data is not sufficiently varied. Approaches that attempt to measure the costs incurred, such as the value of lost leisure time related to household income, can be too broad or subjective. Where 'revealed preferences' are the intended measure, the principle difficulty is that there are very few examples of actual outages that impact directly on consumer behaviour in developed countries.

The alternative approach of using consumer surveys to derive 'direct' estimates of VoLL uses methods that measure precise values of the amount that consumers are willing to pay or accept in relation to avoiding or being compensated for outages. The drawback of this method is that the responses are hypothetical and the task unfamiliar to utility customers.

There are two commonly used stated preference methods: contingency valuation (CV) and choice experiments (CE). CV asks directly what a respondent would pay or want to receive in relation to a specific outage example, whereas CE presents a number of elements all varying at the same time. CV is prone to bias in the form of respondents giving socially acceptable responses and/or answering strategically to influence the study findings. CE deters such responses because of the multiple trade-offs involved in each choice. As a result, CE has been widely used in studies of VoLL.

The chosen approach for this study has drawn extensively from the work carried out by London Economics (LE) in 2013. A paired-choice CE was constructed in which alternative supply interruptions (expressed in terms of duration and frequency) were presented alongside different bill levels.

1.2 Willingness to pay and willingness to accept

Studies consistently observe that the amount that consumers are willing to pay to avoid a deterioration in their current service is considerably less than the amount they would wish to be compensated for experiencing such a deterioration. According to Lanz et al¹, "Asymmetry in willingness to pay (WTP) and willingness to accept (WTA) is one of the most documented phenomena in empirical literature... the empirical evidence is pervasive and gain–loss effects have been observed for a wide variety of economic goods."

Possible explanations for this difference in WTP/WTA values include substitution effects (eg utility customers may perceive limited options for substitution when an outage occurs, so increasing the desire for compensation when a loss in service is experienced), income effects (WTP will be constrained by disposable income) and psychological effects, primarily 'loss aversion', where some decision-makers will perceive losses much more negatively than gains of a similar size. The last point is determined by consumers' 'reference states' – that is, the level of service against which they assess the gain or loss.

The extent of WTP/WTA asymmetry suggests that both measures should be covered in any study of VoLL, indicating lower and upper value bounds. The following aspects of the CE

Bruno Lanz, Allan Provins, Ian J. Bateman, Riccardo Scarpa, Ken Willis, Ece Ozdemiroglu, "Investigating Willingness to Pay–Willingness to Accept Asymmetry in Choice Experiments" In Choice Modelling: The State-of-the-art and The State-of-practice. Published online: 19 Feb 2016; 517-541.

design employed in this study reference in a limited way some of these potential reasons for the asymmetry of values:

- Prior to the CE, respondents were asked to consider the impact of outages on their households/businesses and to indicate how they would cope with the loss of supply (substitution effects)
- In the paired choices presented to survey respondents, neither option was presented as the current level of service. This sought to minimise loss aversion and inertia by avoiding an obvious 'status quo' choice
- In the use of the VoLL derived from the CE models, an adjustment was applied for low income groups to recognise disparity in incomes (income effects).

1.3 Attribute selection

Presenting price and payment levels

Each respondent was shown six paired choices presented in a WTP context and six in a WTA context. This followed the approach used in the LE 2013 study and is consistent with general practice regarding the number of scenarios thought suitable for respondents. The order was varied randomly, but always as blocks of six WTP or six WTA; introductory text before each block highlighted the nature of the trade-offs.

Payments were expressed as 'one-off' payments, in £ values for domestic customers and % of the annual bill for SME customers (with an illustration of the amount based on their reported current bill payment). The latter reflected the wide variation in bills across SMEs. The specific amounts followed the values tested in the LE 2013 study, with the addition of a £12 level requested by Electricity North West to add granularity.

Attribute selection

The selection of attributes for inclusion in the CE was developed in consultation with Electricity North West and focused on the levels that were of most relevance to their operational experience. This required a focus on frequency of outages as well as duration and the impact of advanced warning for planned outages.

To simplify the exercise, respondents were asked to think of the trade-offs in terms of outages occurring at the most inconvenient time of day and day of the week, eg when they are at home and most dependent on supply. This negated the need to include time of day or day of week in the exercise but obviously set the VoLL potentially at its highest value. The argument for this is that distribution network operators (DNOs) do not develop their infrastructure specifically to respond to variations in VoLL over time of day, day of week or time of year. Instead they have to plan for the worst case.

Two waves of research were conducted, one in winter and one in summer, so that time of year could also be controlled for. The final set of attributes used in the study are shown in Figure 1.1 below, alongside the attributes and levels tested in the LE 2013 study.

Figure 1.1 Domestic variables tested in the CE

	London	This study (2017)		
	Economics (2013)	Planned	Unplanned	
Duration of interruption	20 mins 1 hour 4 hours (5 for SMEs)	 1 hour 6 hours More than 6 hours	 Up to 3 minutes 1 hour 6 hours More than 6 hours Major storm/flood causing a power cut lasting 2-3 days 	
Frequency of outages (in a three year period)	Not included	 1 power cut 2-3 power cuts 4-6 power cuts 7 or more power cuts 	 1 power cut 2-3 power cuts 4-6 power cuts 7-14 power cuts 15 or more power cuts 	
Advanced warning (planned only)	Not included	 7 to 14 days' notice and a reminder 12 to 48 hours before we switch off your electricity 14 days' notice 7 days' notice 48 hours' notice 	Not applicable	
Season	Not winter Winter	Conducted in winter Repeated in summer	Conducted in winter Repeated in summer	
Time of day	Peak 3pm-9pm Non-peak 10pm- 2pm	Not included	Not included	
Day of week	Weekday Weekend/bank holiday (SMEs work day, Non-work day)	Not included	Not included	
WTP/ WTA (domestic)	£1 £5 £10 £15	£1 £5 £10 £12 £15	£1 £5 £10 £12 £15	
WTP/ WTA (SME)	1% 5% 10% 15%	1% 5% 10% 12% 15%	1% 5% 10% 12% 15%	

This was the final set of attributes developed for the main body of the research, but prior to this a substantial pilot study was conducted using most of the attributes that were covered in the LE 2013 study. This is reported in Annex 1.1: Pilot study.

1.4 Generating choice cards for the experiment

Development of the experimental design

The potential number of attribute combinations was 240 for 'planned' outages (4 advanced warning x 4 frequency x 3 duration x 5 price) but only 125 for 'unplanned' outages (5 frequency x 5 duration x 5 price). As these numbers are far in excess of what an individual

respondent could realistically assess, numerous 'sets' or blocks of six combinations were generated using an experiment design algorithm designed for this purpose².

Guidance in the literature³ suggests that the minimum number of total combinations that should be used is:

3(K - k + 1)

Where: K = Total number of attribute levelsk = Total number of attributes

This is recommended to ensure sufficient degrees of freedom required for reliable parameter estimation. In the case of this study, this indicated a minimum of 33 combinations for planned outages (3 * ((4 + 4 + 3 + 5) - 4 + 1)) and also a minimum of 33 combinations for unplanned outages (3 * ((5 + 5 + 5) - 3 + 1))). These minima and maxima (33 to 240 for planned and 33 to 125 for unplanned) indicated some flexibility in the number of combinations that could be used for this survey.

With this in mind, domestic respondents saw one block of six scenarios drawn randomly from a design containing 27 blocks (27 for planned and 27 for unplanned), a total of 162 pairs (27 x 6), 324 combinations (162 x 2), though some of the combinations would be repeated across the design. The number of combinations was sufficient to give robust statistical properties (balanced frequency of attribute levels, low correlations between attributes, broad variation for a large and diverse sample of n=4,500), while ensuring that the number of blocks was low enough for practical field management.

For SME respondents, a smaller design was constructed, using nine blocks with six scenarios in each. This produced 54 pairs (9 x 6), 108 combinations (54 x 2). This reflected the smaller sample sizes for this group (n=1,500 in total) and an expectation of greater homogeneity in their preferences.

The main properties of the statistical designs are summarised in Annex 1.2: Statistical designs. A key aspect of the design was to avoid pairs where the choice was obvious to the respondent – for example, if one option was inferior in terms of both outage duration and frequency, price to pay would be lower (or compensation higher) than for the other option.

Sample sizes

The ability of the data to support robust models will not only depend on the efficiency of the design but also the amount of data (respondents) collected. Guidance on minimum sample sizes for analysis is given by the formula⁴:

N > 500c/(t * a)

Where: N = minimum sample for analysis

c = highest number of attribute levels in any one attribute

t = number of choice tasks seen by each respondent

a = number of alternatives in each choice task.

This indicates a minimum figure of about n=200 (500 * 5/(6 *2)) respondents for robust subgroup analysis. Figures 1.2a and 1.2b below show the sample sizes and observations obtained for each design, split by customer type and time of year.

² Sawtooth SSI Web

³ Orme, 2010, Proceedings of the Sawtooth Software Conference, chapter 7

⁴ Ibid

Figure 1.2a: Sample sizes by design category

			Design type		
Customer type	Time of year	Payment context	Planned	Unplanned	
	Winter	WTP	830	1620	
Domostic	winter	WTA	830	1620	
Domestic	Summer	WTP	757	1761	
		WTA	757	1761	
	Winter	WTP	241	319	
SWE	Winter	WTA	241	319	
SIME	Summer	WTP	184	296	
	WTA		184	296	
Total domestic			1587	3381	
Total SME			425	615	

Given the guidelines on minimum sample sizes, there is sufficient data in each of these cells for analysis, though the scope for breaking down the SME sample into sub-groups is most limited. For modelling purposes, the data can be combined by time of year, on the basis that the context (time of the survey) is the only element that is varied.

Figure 1.2b: Observations by design category

			Design type		
Customer type	Time of year	Payment context	Planned	Unplanned	
	Winter	WTP	4980	9720	
Domostia	winter	WTA 4980		9720	
Domestic	Summor	WTP	4542	10566	
	Summer	WTA	4542	10566	
	Winter	WTP	1446	1914	
OME	winter	WINter		1914	
SME	Summor	WTP	1104	1776	
	Summer WTA		1104	1776	
Total domestic			9522	20286	
Total SME			2550	3690	

The discrete choice exercise

Figures 1.3 and 1.4 below give examples of how the discrete choice scenarios were presented to respondents. SME respondents were shown the bill change in both percentage

terms and actual monetary terms, based on their stated current bill level multiplied by the percentage value change.

Each respondent saw six WTP scenarios and six WTA scenarios, the order being randomised across respondents, so that half saw WTP first and half saw WTA first. Introductory screens before each block of six ensured that they were aware of the different question being asked. A 'least counts' procedure was used to ensure that the blocks within each design were evenly distributed across the sample.

Figure 1.3: Example 'main' scenario for domestic customer (planned outage – WTP)

Below are descriptions of two power cuts involving different scenarios. Please select the one that most accurately reflects your view on the amount of money *you would be prepared to pay* to avoid this situation from happening.

WTP	Option A	Option B	
Advance warning of the power cut/s	7 days notice	14 days notice	
Frequency of power cuts/s (over a three-year period)	1 power cut 7 or more power cuts		Notauro
Duration of the power cut/s	6 hours per power cut	1 hour per power cut	Not sure
The amount you pay to avoid this happening	Cost to you: £5	Cost to you: £10	
Please make your selection here	•	۲	0

Please remember this is only a hypothetical situation and payment:

Figure 1.4: Example 'main' scenario for SME customer (unplanned outage – WTA)

Below are descriptions of two power cuts involving different scenarios. Please select the one that most accurately reflects your view on what you *would expect to receive* to accept this situation.

Please remember this is only a hypothetical situation and payment:

WTA	Option A	Option B	
Frequency of power cuts/s (over a three-year period)	7-14 power cuts	4-6 power cuts	
Duration of the power cut/s	More than 6 hours per power cut	6 hours per power cut	Not sure
The amount you receive for this happening	Payment to you: 15% of your annual electricity bill	Payment to you: 5% of your annual electricity bill	
Please make your selection here	0	۲	0

A secondary discrete choice exercise ('mitigation initiatives')

A separate but related objective of the research was to understand how certain initiatives by a DNO could potentially mitigate VoLL by reducing the disutility of outages. A separate

discrete choice exercise was developed for this, but a concern arose that the respondents' evaluation of these mitigating initiatives would be too abstract if not placed in the context of specific outage examples. The decision was therefore made to inter-leave the scenarios of this second exercise among each of the scenarios of the main discrete choice exercise, so that the initiatives could be assessed immediately in the context of what they had chosen with regard to a specific outage scenario.

This is a novel approach in the measurement of WTP/WTA in the utilities sector, though such 'inter-leaved' approaches are not without precedence in other sectors⁵. A potential criticism is that the presence of the secondary 'mitigation' scenarios could have some non-systematic influence on the response to the main WTA/WTP scenarios, either by introducing the notion that the dis-benefits of outages could be partially mitigated and more generally, adding to the cognitive burden of the overall exercise. On the other hand, a potential benefit is that these scenarios break the monotony of the choices – an issue that is often cited by respondents when completing discrete choice experiments.

Although the secondary discrete choice exercise was constructed from a completely separate design, the blocks of six secondary scenarios that appeared with each set of WTA/WTP scenarios were selected so as to keep correlations between the main attributes and the mitigation attributes to a minimum. This way, the main discrete choice exercise worked independently (in statistical terms) from the secondary exercise.

Careful piloting with face-to-face interviews suggested that most respondents understood the exercise and were able to complete the choices without difficulty.

Annex 1.4 provides more detail on the secondary discrete choice exercise.

2 AGGREGATE MULTINOMIAL LOGIT MODEL

2.1 Why estimate aggregate models?

An interim step in the analysis

The main approach to the analysis of the discrete choice exercises was to be a Hierarchical Bayesian (HB) approach, designed to estimate values for individual respondents. Compared to more traditional aggregate models, this approach has the potential to draw out differences in the VoLL of different sub-groups of customers more clearly. In this case, aggregate models refers to models that do not recognise the characteristics of individual respondents or that the data contains repeated measures for each individual.

However, there is value in understanding how conventional multinomial logit model (MNL) models perform with this data. This allows a more direct comparison with the earlier London Economics VoLL work and a basis for comparing and contrasting the final HB results at the aggregate level.

Multinomial logit model

The MNL model is a widely used general model of choice behaviour based on the premise that consumers attach a 'utility' to each of the options available to them and that they choose the option with the highest utility. The model relates to probability of choice and the utility function represented in the model will therefore have a systematic component (representing, for example, the features of the options that appeal to or deter the consumer) and a random component:

⁵ Pinnel, J (IntelliQuest), 1994, Multistage Conjoint Methods to Measure Price Sensitivity, Sawtooth. SKIM, Adaptive Choice-Based Conjoint analysis (ACBC) - https://skimgroup.com/methodologies/adaptive-choice-based-conjoint/

$$Uj = Vj + \varepsilon$$

Where: Uj =Utility of option j

 V_j = The systematic component of the choice of option j

 ε = The random element of the choice of option j

If the random component is assumed to have an extreme value 1 exponential distribution⁶, the model takes the following basic MNL form:

$$Pj = \frac{\exp(Vj)}{\sum_{1}^{k} \exp(Vk)}$$

Where:Pj=Probability of choosing option jVj, Vk=Utility function for each option

It is a necessary assumption in the MNL model that the odds of choosing alternative j over alternative k should be independent of the choice set for all pairs j,k (the independence of irrelevant alternatives).

The logistic regression element of the statistical package for the social sciences (SPSS) analysis package was used to estimate these models. The data is panel data, where all choices that were presented to respondents are stacked. Each respondent provided 18 lines of data (6 scenarios x 3 choices). As indicated above, the estimation procedure makes no recognition of individual respondent characteristics.

Determining the functional form of the models

Duration and frequency

Figures 2.1 - 2.8 show the relationship between each of the attribute levels tested for duration and frequency in the CE and the percentage of choices in favour of one discrete option over another. This information illustrates the underlying relationships in the data. It is logical to expect the percentage choice to decline as duration and or frequency of outage increases and the purpose is to confirm that respondent behaviour is as anticipated.

 $^{6 \}operatorname{Prob}(\epsilon) = \exp\left(-\exp(-\epsilon)\right)$



Figure 2.1: Percentage choice by duration and frequency – <u>domestic planned – willingness to</u> <u>pay</u>

These plots suggest that a linear representation of duration varies widely in terms of fit, but for events more frequent than once per year, a non-linear (logarithmic) representation is appropriate, especially for events occurring 2-3 times in three years. There is no strong suggestion of a possible interaction effect between duration and frequency and a fair amount of inconsistency (the percentage chosen results are not in the expected order for 12 hours, compared to those observed for one hour and six hours).



Figure 2.2: Percentage choice by duration and frequency – <u>domestic planned – willingness to</u> <u>accept</u>

These plots suggest that a linear representation of duration fits well, but for more frequent events, a non-linear (logarithmic) representation could be more appropriate, especially for events occurring 2-3 times in three years. There is a suggestion of a possible interaction effect between duration and frequency:

- At one-hour duration, choice percentage only declines when frequency is four or more times in three years and does not decline further
- At six hours duration, choice declines immediately when frequency is 2-3 times in three years and then less so for more frequent events
- At 12 hours duration, the decline in choice is more regularly in line with increases in frequency.



Figure 2.3: Percentage choice by duration and frequency – <u>domestic unplanned – willingness</u> to pay

These plots suggest that a linear representation of duration varies widely in terms of fit and that a non-linear (logarithmic) representation is appropriate. There is a fair amount of inconsistency in how duration relates to frequency (the percentage chosen results are not in the expected order for 12 hours, compared to those observed for one hour and six hours).



Figure 2.4: Percentage choice by duration and frequency – <u>domestic unplanned – willingness</u> <u>to accept</u>

These plots suggest that a non-linear (logarithmic) representation of duration fits notably better than a linear representation. There also appears to be very little difference between frequency of 'once in three years' and frequency of '2-3 times in three years'.



Figure 2.5: Percentage choice by duration and frequency – <u>SME planned – willingness to</u> pay

These plots suggest that a linear representation of duration varies widely in terms of fit, but for events more frequent than once per year, a non-linear (logarithmic) representation is appropriate, especially for events occurring 2-3 times in three years. There is a fair amount of inconsistency in how duration relates to frequency (the percentage chosen results are not in the expected order for 12 hours, compared to those observed for one hour and six hours).



Figure 2.6: Percentage choice by duration and frequency – <u>SME planned – willingness to</u> <u>accept</u>

These plots suggest that a linear representation of duration fits well, but for more frequent events, a non-linear (logarithmic) representation is more appropriate, especially for events occurring 2-3 times in three years.



Figure 2.7: Percentage choice by duration and frequency – <u>SME unplanned – willingness to</u> pay

These plots suggest that a linear representation of duration varies widely in terms of fit and that a non-linear (logarithmic) representation is more appropriate. There is a fair amount of inconsistency in how duration relates to frequency (the percentage chosen results are not in the expected order for 12 hours and 48 hours, compared to those observed for one hour and six hours).



Figure 2.8: Percentage choice by duration and frequency – <u>SME unplanned – willingness to</u> <u>accept</u>

These plots suggest that a non-linear (logarithmic) representation of duration fits notably better than a linear representation. There also appears to be very little difference between frequency of 'once in three years' and frequency of '2-3 times in three years'.

Price

Figures 2.9 and 2.10 plot the relationship of the 'price' attribute ('bill increase' for WTP and 'compensation' for WTA).



Plots of percentage chosen against price shows strong linear relationships for all domestic groups.



Figure 2.10: Percentage choice by price – <u>SME planned and unplanned, WTP and WTA</u>

Plots of percentage chosen against price shows a relatively strong linear relationship for SME WTP results, but for SME WTA the results suggest minimal relationship between price and percentage chosen. This clearly suggests that over the range of WTA values tested in this study, no compensation is sufficient to offset outages for SMEs.

Logistic regression models

For consistency across all the models, the attribute levels were coded as follows:

- Duration indexed units, where '3 mins' = 1, '1 hour' = 20, '6 hours' = 120, 'More than 6 hours' = 240 and '2-3 days' = 48 hours = 960^7 .
- Frequency 'dummy' (0,1) for each level above 'Once in 3 years'
- Price pounds sterling (domestic)/% change in bill (SME)
- Warning⁸ days in advance, where '7 to 14 days notice' = 10.5, '14 days notice' = 14, '7 days notice' = 7 and '48 hours notice' = 2.

Based on the analysis reported in the preceding tables:

- For the 'planned' models, all parameters were represented as linear
- For 'unplanned' models, duration was represented by the natural log of the index value; frequency and price were represented as linear
- Frequency was represented by dummy (0,1) values multiplied through by duration
- Price was represented as bill increases in the WTP form of the model and as compensation payments in the WTA form of the model
- These approaches applied equally to domestic and SME models.

The utility functions were therefore defined as:

Planned

Uj = a0 + b1j * duration + b2j * (duration * freq2 - 3) + b3j * (duration * freq4 - 6) + b4j * (duration * freq7 +) + b5j * warning + cj * price + d * (don't know)

Unplanned

 $Uj = a0 + b1j * \ln(duration) + b2j * (\ln(duration) * freq2 - 3) + b3j * (\ln(duration) * freq4 - 6 + b4j * \ln duration * freq7 - 14 + b5j * \ln duration * freq15 + + cj * price + d*(don't know)$

The constant a_0 is there to detect any potential left/right bias and parameter d represents the 'don't know' option.

The WTP and WTA values are calculated by summing the coefficients b1 to b5, as they apply, and dividing through by the coefficient c (price)⁹. Standard errors or the WTP and WTA were calculated from the variance (standard error ^ 2) of the model coefficients, applying the 'delta method', as used in the LE study for the same purpose¹⁰.

A final step in the calculations is to divide the WTP/WTA estimate through by the average domestic hourly usage in MW to give a VoLL in MWh.

The model specification was selected from a number of alternatives, reported in Annex 1.3.

⁷ This was consistent with the coding used in the LE study. '3 mins' and '2-3 days' only apply to unplanned outages

⁸ Only applicable to planned outages

 ⁹ For a full derivation of this method, refer to London Economics, 2013, The Value of Lost Load (VoLL) for Electricity in Great Britain, p100-101
 10 London Economics, 2013, The Value of Lost Load (VoLL) for Electricity in Great Britain, p17

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Figure 2.11: Logistic regression results – domestic planned – willingness to pay

Sample size	N=1,587, Obs = 28,566		
	В	SE	Sig.
duration (20,120,240)	001	.000	.000
duration * freq2_3 (2-3 times in 3 years)	001	.000	.000
duration * freq4_6 (4-6 times in 3 years)	003	.000	.000
duration * freq7+ (7 or more times in 3 years)	004	.000	.000
Warning	.009	.004	.009
Price (compensation)	129	.003	.000
Don't know	-2.233	.056	.000
Constant	.907	.051	.000
Nagelkerke R Square		14.8	
Correct classification overall (%)		70.5	

WTP estimate for a one-hour outage:	£0.15 (-0.001 * 20/-0.129)
Standard error of WTP:	£0.08
VoLL equivalent for 1 MWh:	£327 (£0.15/0.00045, where 0.00045 is average domestic usage per hour)
Confidence interval (95%):	£154 – £500

Figure 2.12: Logistic regression results – Domestic planned – willingness to accept

Sample size	N=1,587, Obs = 28,566		
Sample Size	В	SE	Sig.
duration (20,120, 240)	002	.0002	.000
duration * freq2_3 (2-3 times in 3 years)	003	.0003	.000
duration * freq4_6 (4-6 times in 3 years)	004	.0003	.000
duration * freq7+ (7 or more times in 3 years)	006	.0003	.000
Warning	.010	.003	.004
Price (compensation)	.048	.003	.000
Don't know	-2.150	.056	.000
Constant	029	.045	.520
Nagelkerke R Square		25.1	
Correct classification overall (%)		72.5	

WTA estimate for a one-hour outage:	£0.99 (-002 * 20/0.048)
Standard error of WTP:	£0.22
VoLL equivalent for 1 MWh:	£2,208 (£0.99/0.00045, where 0.00045 is average domestic usage per hour)
Confidence interval (95%):	£1,717 – £2,698

Figure 2.13: Logistic regression results – <u>Domestic unplanned – willingness to pay</u>

Sample size	N=3,381, Obs = 60,858			
	В	SE	Sig.	
Ln(duration) (1,20,120,240,960)	049	.006	.000	
Ln(duration) * freq2_3 (2-3 times in 3 years)	030	.007	.000	
Ln(duration) * freq4_6 (4-6 times in 3 years)	077	.007	.000	
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	092	.007	.000	
Ln(duration) * freq15+ (15 or more times in 3 years)	123	.007	.000	
Price (compensation)	101	.002	.000	
Don't know	-1.964	.032	.000	
Constant	.804	.027	.000	
Nagelkerke R Square		10.5		
Correct classification overall (%)		69.7		

WTP estimate for a one-hour outage:	£1.45 (-0.049 * Ln(20)/-0.101)
Standard error of WTP:	£0.36
VoLL equivalent for 1 MWh:	£3,213 (£1.45/0.00045, where 0.00045 is average domestic usage per hour)
Confidence interval (95%):	£2,414 – £4,012

Figure 2.14: Logistic regression results – domestic unplanned – willingness to accept

Sample size	N=3,381, Obs = 60,858			
Sample Size	В	SE	Sig.	
Ln(duration) (1,20,120,240,960)	-0.155	0.006	0.000	
Ln(duration) * freq2_3 (2-3 times in 3 years)	0.006	0.007	0.417	
Ln(duration) * freq4_6 (4-6 times in 3 years)	-0.024	0.007	0.001	
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	-0.116	0.007	0.000	
Ln(duration) * freq15+ (15 or more times in 3 years)	-0.135	0.007	0.000	
Price (compensation)	0.064	0.002	0.000	
Don't know	-1.920	0.021	0.000	
Nagelkerke R Square		32.6		
Correct classification overall (%)		71.8		

WTA estimate for a one-hour outage:	£7.32 (-0.155 * Ln(20)/0.064)
Standard error of WTP:	£0.33
VoLL equivalent for 1 MWh:	£16,257 (£7.32/0.00045, where 0.00045 is average domestic usage per hour)
Confidence interval (95%):	£14,838 – £17,677

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Figure 2.15: Logistic regression results - SME planned - willingness to pay

Sample size	N=425, Obs = 7,650			
	В	SE	Sig.	
duration (20,120,240)	001	.001	.066	
duration * freq2_3 (2-3 times in 3 years)	001	.001	.027	
duration * freq4_6 (4-6 times in 3 years)	004	.001	.000	
duration * freq7+ (7 or more times in 3 years)	003	.001	.000	
Warning	.036	.006	.000	
Price (% bill increase)	047	.006	.000	
Don't know	-2.140	.089	.000	
Constant	.143	.060	.017	
Nagelkerke R Square		19.0		
Correct classification overall (%)		68.1		

WTP estimate for a one-hour outage:	£10.83 ((-0.001 * 20/-0.047) * £2,500/100, where £2,500 is the average annual bill)
Standard error of WTP:	£11.87
VoLL equivalent for 1 MWh:	£3,222 (£10.83/0.0033597, where 0.0033597 is average SME usage per hour)
Confidence interval (95%):	£0 – £6,755

Figure 2.16: Logistic regression results – <u>SME planned – willingness to accept</u>

N=425, Obs = 7,650			
В	SE	Sig.	
002	.000	.000	
002	.001	.000	
003	.001	.000	
006	.001	.000	
.036	.007	.000	
.012	.006	.067	
-3.086	.116	.000	
.056	.057	.324	
	31.9		
	67.6		
	B 002 002 003 006 .036 .012 -3.086 .056	B SE 002 .000 002 .001 003 .001 006 .001 .036 .007 .012 .006 -3.086 .116 .056 .057 31.9 67.6	

 WTA estimate for a one-hour outage:
 £94.31 ((-0.002 * 20/0.012) * £2,500/100, where £2,500 is the average annual bill)

 Standard error of WTP:
 £108.83

 VoLL equivalent for 1 MWh:
 £28,071 (£94.31/0.0033597, where 0.0033597 is average SME usage per hour)

 Confidence interval (95%):
 £0 – £60,464

Figure 2.17: Logistic regression results – <u>SME unplanned – willingness to pay</u>

Sample size	N=615, Obs = 11,070			
	В	SE	Sig.	
Ln(duration) (1,20,120,240,960)	107	.015	.000	
Ln(duration) * freq2_3 (2-3 times in 3 years)	035	.016	.031	
Ln(duration) * freq4_6 (4-6 times in 3 years)	080	.017	.000	
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	111	.016	.000	
Ln(duration) * freq15+ (15 or more times in 3 years)	149	.017	.000	
Price (% bill increase)	084	.005	.000	
Don't know	-3.529	.086	.000	
Constant	1.257	.064	.000	
Nagelkerke R Square		27.6		
Correct classification overall (%)		73.9		

WTP estimate for a one-hour outage:	£95.30 ((-0.107 * Ln(20)/-0.084) * £2,500/100, where £2,500 is average annual bill)
Standard error of WTP:	£27.99
VoLL equivalent for 1 MWh:	£28,367 (£95.30/0.0033597, where 0.0033597 is average domestic usage per hour)
Confidence interval (95%):	£20,036 – £36,698

Figure 2.18: Logistic regression results – SME unplanned – willingness to accept

Samula siza	N=615, Obs = 11,070			
	В	SE	Sig.	
Ln(duration) (1,20,120,240,960)	140	.014	.000	
Ln(duration) * freq2_3 (2-3 times in 3 years)	016	.016	.344	
Ln(duration) * freq4_6 (4-6 times in 3 years)	144	.017	.000	
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	149	.017	.000	
Ln(duration) * freq15+ (15 or more times in 3 years)	193	.017	.000	
Price (% bill compensation)	013	.005	.012	
Don't know	-4.245	.111	.000	
Constant	.981	.068	.000	
Nagelkerke R Square		36.7		
Correct classification overall (%)		71.8		

WTA estimate for a one-hour outage:	- (sign for price is counter-intuitive)
Standard error of WTP:	- (sign for price is counter-intuitive)
Confidence interval (95%):	- (sign for price is counter-intuitive)

The counter-intuitive results from the model reported in Figure 2.18 above is a concern. Reference to the second chart in Figure 2.10 shows that the percentage chosen when the compensation is +1% is high relative to the +5% and +10% values. This suggests that this small level of compensation is unlikely to be influencing choices but is instead being 'pulled' into this position by the strong influence of frequency and duration. The experimental design minimised correlation between attribute levels, but the requirement that no choices should be obvious (ie one option having longer duration and more frequent outages for less compensation) could allow this to occur. The apparent dominance of the duration and frequency attributes over this lowest level of compensation has the effect of making the price coefficient weak and the sign counter-intuitive (for WTA, it should be positive).

If the price parameter is fitted only to compensation of +5% or more, a stronger model results, as indicated in Figure 2.19 below. Here, the magnitude of the coefficients is greater and the fit improved. The confidence interval is correspondingly narrower.

Figure 2.19: Logistic regression revised results – SME unplanned – willingness to accept (see Figure 2.18)

Sample size	N=615, Obs = 9,553				
Sample Size	В	SE	Sig.		
Ln(duration) (1,20,120,240,960)	113	.015	.000		
Ln(duration) * freq2_3 (2-3 times in 3 years)	.016	.019	.380		
Ln(duration) * freq4_6 (4-6 times in 3 years)	109	.018	.000		
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	140	.019	.000		
Ln(duration) * freq15+ (15 or more times in 3 years)	193	.019	.000		
Price (% bill compensation) – 1% level omitted	.058	.004	.000		
Don't know	-3.264	.087	.000		
Nagelkerke R Square		50.2			
Correct classification overall (%)		75.9			

WTA estimate for a one-hour outage:	£147.11 (-0.113 * Ln(20)/0.058) * £2,500/100, where £2,500 is average annual bill)
Standard error of WTP:	£43,787 (£147.11/0.0033597 where 0.0033597 is average SME usage per hour)
Confidence interval (95%):	£30,997 – £56,576

Review of VoLL estimations based on logistic regression

The VoLL derived from these models implies higher values for domestic customers than those observed in the LE study.

		This stu regr	dy (logistic ession)	LE study (logistic regression) ¹¹		
Block		VoLL in MWh Interval		Peak VoLL in MWh (Annual average 2013)	Value range ¹²	
		WTP	£327	£154 – £500		
	Planned	WTA	£2,208	£1,717 – £2,698		
Domestic		WTP	£3,213	£2,414 – £4,012	£968 (£978)	£430 – £1,500 (£0 – £2,165)
Unplanned	WTA	£16,257	£14,838 – £17,677	£12,246 (£8,600)	£10,580 – £13,880 (£4,638 – £15,235)	
	Diannad	WTP	£3,222	£0 – £6,755		
	Fianneu	WTA	£28,071	£0 – £60,464		
SME	Upplappod	WTP	£28,367	£20,036 – £36,698	£23,442 (£22,822)	£330 – £78,910 (£19,271 – £27,859)
	onpiainieu	WTA ¹³	£43,787	£30,997 – £56,576	£35,726 (£37,637)	£10,360 – £61,090 (£33,358 – £44,149)

Figure 2.20: Summary of VoLL estimations -	this study v LE study
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The values from the LE study correspond to unplanned outages as no reference was made to warnings in that study. The generally higher values of VoLL observed for this study may reflect differences in the way the two studies were conducted:

- The span of duration values tested in the LE study was narrower than in this study (20 minutes, one hour, four hours v thee minutes, one hour, six hours 12 hours and 48 hours)
- Frequency of outages was a variable; in the LE study it was fixed at 'once every 12 years'; in this study, the lowest level of frequency was once every three years (judged

¹¹ London Economics, 2013, The Value of Lost Load (VoLL) for Electricity in Great Britain, p109, p111. The VoLL figure here is an average of peak values for the whole year, encompassing winter / non-winter, weekend / weekday. The peak values have been chosen for comparison because the exercise in this study was presented to respondents in terms of the time when an outage would be of most inconvenience to them. The average for the whole year including off-peak is given in brackets.

¹² The value range contains two sets of results taken from the LE study. The upper figures are 95% confidence intervals calculated from information provided in Tables 64/65, 70/71 of the LE report and are therefore an approximation. The lower figures in brackets are the lowest and highest values estimated across the variations of peak / off-peak, winter / non-winter, weekend / weekday. This serves to indicate the broad variability of the values.

¹³ Based on a price parameter where the smallest level of compensation (1%) has been omitted.

to be the current level of service for most DNOs) and a range of higher frequencies were also tested

- In this study, the context for the choices was the respondent's most inconvenient time for when an outage occurs; in the LE study a variety of general time categories were tested: inter/non-winter, peak/off-peak, weekday/weekend
- The number of attributes that respondents had to consider in the CE was consequently lower in this study: three (duration, frequency, bill price) v five (duration, time of year, time of day, day of week, bill price)
- There is a period of five years between the two studies, so effects of inflation would be expected, representing an overall increase of around10%, reflective of inflation of approximately +10% in the UK over that period.

These results suggest a significant difference for domestic consumers when compared to the earlier LE study. The confidence intervals for this study do not include the LE estimates. As indicated in the above statements, the results for this study reflect the 'worst case scenario' for customers, unlike the LE study that examined a range of less specific events (variations by time of day, day of week, time of year) and lower impact events (no outages over four hours and a reduced frequency: no more than once every 12 years).

3 HIERARCHICAL BAYESIAN ANALYSIS

3.1 Why HB estimation?

HB analysis introduces an extra level of sophistication to the analysis of discrete choice experiments. Unlike the logistic regression models reported in the previous section, this approach recognises that the choices are clustered by individual respondents.

HB analysis has the ability to provide estimates of individual part-worth utilities given only a few choices by each individual respondent. It does this by 'borrowing' information from population information (means and covariances) describing the preferences of other respondents in the same dataset¹⁴. This is particularly useful when the focus of the research is to understand the differences between respondent sub-groups, as in this study. The Sawtooth CBC/HB package was used for this analysis (CBC = choice-based conjoint).

The 'hierarchy' in this modelling approach is composed of two steps:

- At the 'higher' level, individuals' part-worths are described by a multivariate normal distribution and characterised by a vector of means and a matrix of covariances¹⁵
- At the 'lower' level it is assumed that, given an individual's part worth utilities, their probabilities of choosing particular alternatives take the form of an MNL model.

Through an iterative process, a set of mean part-worth estimates and standard deviations are estimated for each individual respondent.

In this analysis the functional forms of the models were the same as described for the logistic regression models. The values of most interest are WTA for unplanned outages, domestic and SME, as these correspond to the results that were used in the LE study to determine the overall VoLL.

¹⁴ Sawtooth, 2016, Software for Hierarchical Bayes Estimation for CBC Data v5

¹⁵ A prior variance of 1 with 5 prior degrees of freedom. Advice from Sawtooth is that "With many choice tasks per individual and few parameters to estimate, as in this study, the priors have relatively little effect on the posterior estimates of beta."

3.2 Domestic willingness to accept compensation for unplanned outages

Figure 3.1 shows the model outputs for all domestic customers. This produced a similar VoLL to the logistic regression analysis for the total sample. In calculating the mean coefficient values, outliers at the 2.5% lower and upper percentiles were excluded.

When the analysis was undertaken for sub-groups, the average domestic usage figure of 0.00045 taken from the LE study was modified to reflect the average consumption of each group relative to the total sample¹⁶. This varied over a range of approximately 0.9 - 1.1.

Somelo size	N=3,381			
	В	SE		
Ln(duration) (1,20,120,240,960)	-0.3293	0.0076		
Ln(duration) * freq2_3 (2-3 times in 3 years)	-0.0726	0.0070		
Ln(duration) * freq4_6 (4-6 times in 3 years)	-0.1106	0.0069		
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	-0.3341	0.0083		
Ln(duration) * freq15+ (15 or more times in 3 years)	-0.3726	0.0087		
Price (compensation)	0.1253	0.0037		
Don't know	-7.3113	0.0840		
RLH ¹⁷		0.73		
Percent correct (%)		68		

Figure 3.1: CBC/HB results – Domestic unplanned – willingness to accept

WTP estimate for a one-hour outage:	£7.87 (-0.3293 * Ln(20)/0.1253)
Standard error of WTA:	£0.29
VoLL equivalent for 1 MWh:	£17,481 (£7.87/0.00045, where 0.00045 is average domestic usage per hour)
Confidence interval (95%):	£16,209 – £18,753 ¹⁸
VoLL from logistic regression:	£16,257 (£14,838 – £17,677)

¹⁶ MPAN numbers that could be associated with individual respondents were used to obtain the average consumption 17 RLH is the geometric mean of the predicted probabilities: with three alternatives in this CE, the random value of RLH is 0.33 (1/3 choices); a

¹⁷ RLH is the geometric mean of the predicted probabilities: with three alternatives in this CE, the random value of RLH is 0.33 (1/3 choices); a value of 0.73 therefore indicates that the model is more than twice as strong as a purely random result. In a similar way, "Percent Certainty" indicates how much better the solution is than chance, as compared to a "perfect" solution.

¹⁸ This is based on the frequentist notion of the 95% confidence interval. As noted by Orme, 2016, 'Confidence intervals for interpreting HB estimations', Sawtooth Software Forum, this is "not truly appropriate for Bayesian estimates. But, we're already departing from proper Bayesian by collapsing the 'used' draws per respondent into a single point estimate per part-worth utility". The range reported here is based on:

The mean of the standard deviations calculated for each variable for each respondent, divided through by the square root of the sample size, to give an approximate standard error.

[•] The 'delta method' applied to calculate an approximate confidence interval for the WTA estimate

Figures 3.2 and 3.3 summarise the VoLL for a range of sub-groups, rank ordered by their value relative to the total sample domestic VoLL.

- The groups that require most compensation are those who want to improve supply, who are in fuel poverty, live in rural areas, are off-gas, have an electric vehicle or electric heat pump or are aged 30 44 years, in socio-economic group C1/C2.
- Counter-intuitively, with regard to power cuts, those that have no or moderate experience of power cuts require higher than average compensation, while those that require least compensation have experience of a large scale interruption in the last 12 months, have experienced a planned power cut, are classified as worst served.
- Similarly low values were identified among customers who are medically dependent on electricity and those in lower social groups DE.

Figure 3.2: VoLL values higher than total sample – <u>domestic unplanned – willingness to</u> <u>accept</u>

Sub-group	n	WTA	VoLL (MWh)	Lower	Upper	Index v total sample
Want to improve supply	431	£11.28	£25,334	£19,240	£31,429	145
Fuel poverty	239	£9.43	£21,646	£18,837	£24,456	124
Domestic – EV	275	£9.20	£21,493	£1,264	£41,722	123
Rural	1023	£9.63	£21,314	£18,361	£24,268	122
SEG: C1	1040	£9.05	£20,053	£17,667	£22,439	115
Age: 30 – 44	770	£8.95	£20,042	£17,017	£23,066	115
Domestic – HP	428	£8.98	£19,911	£5,578	£34,243	114
Experienced one unplanned power cut	723	£8.85	£19,755	£16,646	£22,865	113
Experienced no power cuts	1178	£8.63	£19,221	£16,534	£21,908	110
SEG: C2	569	£8.54	£19,217	£15,634	£22,801	110
LCT users	960	£8.69	£18,973	£11,743	£26,203	109
Experienced two or three unplanned power cuts	847	£8.65	£18,780	£15,957	£21,603	107
Off-gas	721	£7.13	£18,543	£14,598	£22,489	106
Summer	1690	£8.39	£18,496	£16,505	£20,487	106
Female	1791	£8.26	£18,432	£16,373	£20,490	105
Domestic – PV	538	£8.42	£17,884	£7,580	£28,189	102
SEG: AB	835	£8.13	£17,867	£15,241	£20,493	102

For a one-hour outage once every three years

Figure 3.3: VoLL values lower than total sample – <u>domestic unplanned – willingness to</u> <u>accept</u>

For a one-hour outage	e once every three y	/ears
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Sub-group	n	WTA	VoLL (MWh)	Lower	Upper	Index v total sample
Age: 60+	994	£7.80	£17,237	£14,719	£19,755	99
Vulnerable	1951	£7.60	£16,941	£15,005	£18,876	97
Age: 45-59	844	£7.59	£16,921	£14,973	£18,869	97
Male	1510	£7.62	£16,891	£15,272	£18,510	97
Experienced power cuts	2203	£7.57	£16,802	£15,376	£18,228	96
Age: 18-29	702	£7.50	£16,516	£13,252	£19,779	94
High usage	328	£7.60	£16,504	£12,952	£20,056	94
Winter	1620	£7.39	£16,464	£14,828	£18,101	94
Low usage	1216	£7.26	£16,371	£14,510	£18,231	94
Experienced planned power cut	859	£7.30	£16,161	£13,395	£18,928	92
Urban	2353	£7.16	£15,934	£14,572	£17,295	91
Want to keep bills constant	1265	£7.19	£15,863	£14,024	£17,702	91
SEG: DE	843	£6.15	£13,667	£11,479	£15,855	78
Medically dependent on electricity	310	£5.97	£13,487	£9,517	£17,457	77
Experienced large scale interruption L12M	377	£5.82	£12,140	£7,660	£16,619	69
Worst served	163	£3.16	£6,894	£2,345	£11,442	39

Grey font indicates small sample size, interpret with caution

Customers' willingness to accept compensation for outages will reflect their own economic circumstances to some extent. To adjust for this, the VoLL for each group can be modified to indicate the likely value if the average income of that group was the same as for the total population. The adjustment was:

VoLL sub-group, income adjusted = VoLL * average income total sample/average income sub-group

The effect of this adjustment is shown in Figure 3.4. These results suggest that the change in VoLL can be substantial, notably for fuel poor, lower socio-economic groups, vulnerable and those with low electricity usage.

-igure 3.4: Income-adjusted VoLL values -	- domestic unplanned –	willingness to accept
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Sub-group	VoLL	VoLL (Income adjusted)	Ratio v Unadjusted VoLL
Want to improve supply	£25,334	£23,633	93
Fuel poverty	£21,646	£32,470	150
Domestic – EV	£21,493	£15,589	73
Rural	£21,314	£21,652	102
SEG: C1	£20,053	£20,621	103
Age: 30 – 44	£20,042	£17,905	89
Domestic – HP	£19,911	£18,785	94
Experienced one unplanned power cut	£19,755	£19,646	99
Experienced no power cuts	£19,221	£20,444	106
SEG: C2	£19,217	£21,091	110
LCT users	£18,973	£17,494	92
Experienced two or three unplanned power cuts	£18,780	£17,960	96
Off-gas	£18,543	£21,461	116
Summer	£18,496	£18,723	101
Female	£18,432	£19,799	107
Domestic – PV	£17,884	£17,140	96
SEG: AB	£17,867	£11,901	67
Want to keep reliability	£17,745	£18,654	105
Age: 60+	£17,237	£19,372	112

Sub-group	VoLL	VoLL (Income adjusted)	Ratio v Unadjusted VoLL
Vulnerable	£16,941	£19,632	116
Age: 45-59	£16,921	£16,379	97
Male	£16,891	£15,817	94
Experienced power cuts	£16,802	£16,296	97
Age: 18-29	£16,516	£17,490	106
High usage	£16,504	£14,288	87
Winter	£16,464	£16,302	99
Low usage	£16,371	£19,665	120
Experienced planned power cut	£16,161	£15,668	97
Urban	£15,934	£15,817	99
Want to keep bills constant	£15,863	£16,344	103
SEG: DE	£13,667	£20,501	150
Medically dependent on electricity	£13,487	£18,013	134
Experienced large scale interruption L12M	£12,140	£11,768	97
Worst served	£6,894	£7,595	110
Want to improve supply	£25,334	£23,633	93

3.3 SME willingness to accept compensation for unplanned outages

Figure 3.5 shows the model outputs for all SME customers. This produced a slightly higher VoLL compared to the logistic regression analysis for the total sample. In calculating the mean coefficient values, outliers at the 2.5% lower and upper percentiles were excluded.

Figure 3.5: CBC/HB results – SME unplanned – willingness to accept

Sample size	N=615			
	В	SE		
Ln(duration) (1,20,120,240,960)	-0.3737	0.0395		
Ln(duration) * freq2_3 (2-3 times in 3 years)	0.0631	0.0487 ¹⁹		
Ln(duration) * freq4_6 (4-6 times in 3 years)	-0.2658	0.0501		
Ln(duration) * freq7-14 (7 to 14 times in 3 years)	-0.3097	0.0515		
Ln(duration) * freq15+ (15 or more times in 3 years)	-0.4838	0.0490		
Price (compensation)	0.1207	0.0178		
Don't know	-5.2185	0.2888		
RLH		0.70		
Percent correct (%)		63		

WTA estimate for a one-hour outage:	£226.70 (-0.3737 * Ln(20)/0.1207)* £2,500/100
Standard error of WTP:	£1.30
VoLL equivalent for 1 MWh:	£47,560 (£226.70 /0.00336, where 0.00336 is average SME usage per hour)
Confidence interval (95%):	£45,289 - £49,830
VoLL from logistic regression:	£43,787 (£30,997 – £56,576)

In the same way as for domestic sub-groups, the average SME usage figure of 0.00336, taken from the LE study, was modified to reflect the average consumption of each group relative to the total sample²⁰. This varied over a range of approximately 0.8 - 1.2.

Figures 3.6 and 3.7 summarises the VoLL for a range of sub-groups, rank ordered by their value relative to the total sample SME VoLL.

- The groups that require most compensation are those who were surveyed in the summer, are located in rural areas, have some experience of unplanned power cuts or are off-gas
- Those requiring less compensation were those surveyed in winter, have not experienced unplanned power cuts or have experienced planned power cuts
- In contrast to domestic customers, those that say they want to improve supply or maintain reliability require less compensation. The comparatively small sample sizes for these groups suggests that these findings should be treated with caution.

¹⁹ Not significantly different from zero

²⁰ MPAN numbers that could be associated with individual respondents were used to obtain the average consumption

Figure 3.6: VoLL values higher than total sample - SME unplanned - willingness to accept

For a one-hour outage	once every three years
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Sub-group	n	WTA	VoLL (MWh)	Lower	Upper	Index v total sample
Summer	287	£228.64	£77,843	£73,572	£82,115	164
Rural	118	£216.91	£68,452	£58,201	£78,703	144
Experienced power cuts	376	£153.25	£51,341	£47,981	£54,701	108
Off-gas	316	£152.44	£49,056	£46,406	£51,706	103

Grey font indicates small sample size, interpret with caution

Figure 3.7: VoLL values lower than total sample - SME unplanned - willingness to accept

For a d	one-hour	outage	once	every	three	years
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Sub-group	n	WTA	VoLL (MWh)	Lower	Upper	Index v total sample
Want to keep bills constant	188	£143.51	£45,823	£42,297	£49,349	96
Urban	489	£152.05	£43,885	£41,680	£46,090	92
Experienced planned power cut	185	£123.86	£43,714	£39,058	£48,371	92
Want to keep reliability	141	£124.13	£38,564	£33,832	£43,296	81
Experience no power cuts	239	£147.00	£38,167	£35,648	£40,686	80
Want to improve supply	161	£130.71	£32,919	£30,044	£35,793	69
Winter	319	£73.31	£19,099	£17,079	£21,119	40

Grey font indicates small sample size, interpret with caution

3.4 Observations on the results by season

The large difference in the SME VoLL observed for those completing the survey in summer compared to winter would appear counter-intuitive, as it might be anticipated that customers would be more sensitive to the impact of outages when considering them during winter than in the summer.

If the difference had been relatively small, as is seen for domestic customers, it could be explained by the fact that respondents were asked to make their choices in the context of the worst possible time. Therefore choices should reflect this context regardless of whether the surveys were undertaken in summer or winter.

The large difference for SMEs suggests some other explanation, which may be due to the relatively small sample sizes. It implies differences across the samples for each season that

are not readily explainable from the respondent profiles or compensated for by the weighting of the data.

ANNEX 1.1: PILOT SURVEY

Background

Although Hierarchical Bayesian analysis was used as the main approach to derive the utilities for estimation of WTP and WTA, a logistic regression approach was also used to try to replicate results comparable to those from the LE models.

Sufficient data was available to make meaningful comparisons for domestic customers (samples at the pilot stage for SME, totalling 104, were regarded as too small for a meaningful comparison with the LE study). A pilot sample of 826 domestic customers was obtained through a mixture of online self-completion and face-to-face interviewer-administered surveys. Each respondent completed a discrete choice exercise similar in form to the LE study.

The data was arranged in the same way as the LE study, including a 'don't know option' and rescaling all variables to a 'dummy' (0 and 1) code or as a metric scale (duration and price). It should be noted that there were key differences in the design so models could not be run identically to LE.

	London Economics	Impact
Duration	Covered 20 minutes, one hour, four hours	Three minutes, one hour, four hours, 12 hours, 12-24 hours, 2-3 days
Winter	Included a winter variable	Pilot survey was not conducted in winter
Planned	Not included	Included
Peak time	Peak time considered 3-9pm	Peak domestic – 3-9pm Peak SME – 9-3pm
Advanced warning	Not included	Included
Price	£1, £5, £10, £15 1%, 5%, 10%, 15%	£1, £3, £5, £7, £12, £15 1%, 3%, 5%, 7%, 12%, 15%
Frequency	Did not include frequency of outage due to perceived complication	Outages per three years: 1, 2-3, 4-6, 7-14, 15+

Key differences in design

The model was specified as:

 $Pi = a + b1. duration + b2. dur_{freq} + b3. dur_{wday} + b4. bill + don't know$

Where: Pi = probability of choosing option i b1= duration of outage in minutes b2= duration x frequency of outage in three years b3= duration x weekday/weekend (1,0) b4= bill change

WTP and WTA values were calculated by taking the ratio of (b1+b2+b3) to b4.

Comparisons – domestic

Willingness to pay

Despite some of the key differences listed above, the WTP estimations for domestic users, derived from this study using models as similar as possible to the LE model, produced much lower estimates for weekend MWh values and higher (> 0) for weekday values. A winter variable was not included, but in these pilot exercises respondents were asked to consider the most inconvenient time for an outage to occur, so the comparison is made against 'winter', identified in the LE study as the worst time of year.

The resulting WTP values are shown below, together with the corresponding LE results:

Duration	Wir Pe Wee	nter eak kend	er Win k Not nd Wee		Win Pe Wee	Winter Peak Weekday		Winter Not Peak Weekday	
	LE	Impact	LE	Impact	LE	Impact	LE	Impact	
20 mins	£0.32	£0.07	£0.32	£0.11	£0.04	£0.07	£0.05	£0.12	
1 hour	£0.96	£0.22	£0.97	£0.34	£0.12	£0.22	£0.14	£0.35	
4 hours	£3.82	£0.28	£3.89	£1.37	£0.50	£0.89	£0.57	£1.28	
1 MWh	£1,651	£490	£2,240	£762	£208	£495	£315	£768	

*Based on 0.00045MWh consumption

Model outputs

	В	S.E.	Wald	df	Sig.	Exp(B)
Duration	055	.007	65.787	1	.000	.946
Duration x frequency	.020	.008	5.476	1	.019	1.020
Duration x weekday	.000	.007	.003	1	.956	1.000
Bill	161	.005	887.747	1	.000	.852
Don't know	-2.844	.070	1648.489	1	0.000	.058
Constant	1.041	.053	379.618	1	.000	2.833

Willingness to accept

Given some of the key differences listed above, the estimations of WTA values for domestic users are reasonably close to the LE results.

Duration	Wir Pe Weel	nter ak kend	ter Win Ik Not end Wee		Winter Wi Not peak Po Weekend Wee		Winter Not Peak Weekday	
	LE	Impact	LE	Impact	LE	Impact	LE	Impact
20 mins	£2.28	£1.79	£1.59	£1.20	£2.05	£1.67	£1.36	£1.08
1 hour	£6.84	£5.37	£4.77	£3.60	£6.16	£5.01	£4.09	£3.24
4 hours	£127.37	£21.49	£19.07	£14.40	£24.64	£20.06	£16.35	£12.97
1 MWh	£11,820	£11,930	£10,982	£7,994	£10,289	£11,136	£9,100	£7,200

*Based on 0.0005MWh consumption

	В	S.E.	Wald	df	Sig.	Exp(B)
Duration	092	.006	239.813	1	.000	.912
Duration x frequency	045	.009	24.932	1	.000	.956
Duration x weekday	.009	.007	1.549	1	.213	1.009
Bill	.026	.005	29.149	1	.000	1.026
Don't know	-2.754	.079	1215.925	1	.000	.064
Constant	.223	.051	19.206	1	.000	1.250

ANNEX 1.2: STATISTICAL DESIGNS (MAIN SURVEY)

Generating the designs

The Sawtooth Survey Sampling International (SSI) web design package was used to generate the statistical design. As indicated in the SSI manual: "Optimally efficient CBC designs can estimate all part-worths with optimal precision; meaning that the standard errors of the estimates are as small as possible, given the total observations (respondents x tasks), the number of product concepts displayed per task, and respondent preferences. CBC's random design strategies generally result in very efficient designs. These designs are not *optimally* efficient, but are nearly so."²¹

The lack of any prohibitions (ie disallowed combinations of attribute levels) in the designs and the large sample size planned for the study indicated that an efficient design should be achievable for the number of attributes and levels being tested. The only constraint was the restricted number of versions (27 blocks of six for domestic customers, nine blocks of six for SMEs).

Design profile statistics

Domestic unplanned

Figures 1.2.1a to 1.2.4b below summarises the profile statistics for the domestic unplanned design.

As described in the SSI manual, an approximation is made of the relative standard error of each main effect under aggregate analysis and assuming that each version is seen just once across the total observations. Ordinary least squares (OLS) is used for this purpose. This test design method gives relative standard error estimates similar to (but not identical to) those of MNL. With this test, the emphasis is not on a precise estimate of each standard error for a given number of respondents, but rather the pattern of their relative magnitudes with respect to one another. These are reported for each design in the 'a' figures below.

The 'advanced test' design estimates the absolute precision of the parameter estimates under aggregate estimation, based on the combined elements of design efficiency and sample size (respondents x tasks). The test is useful for both standard and complex designs that include interactions or alternative-specific effects. It also reports a widely accepted measure of design efficiency called D-efficiency, which summarises the overall relative precision of the design.

The advanced test simulates random (dummy) respondent answers. The test is run with respect to a given model specification (main effects only in this case). To perform the advanced test, a total sample similar to those anticipated for the main survey was used, eg 3,000 domestic customers (ie approximately the number that would see the unplanned exercise). It was also assumed that 5% would choose 'not sure'. Although it is possible to assume prior values for the coefficients (for example, willingness-to-pay ratios for duration v price attributes), it is more common not to assume any prior values. Using random respondent answers in this way is considered a robust approach, because it estimates the efficiency of the design for respondents with heterogeneous and unknown preferences. Once the data set has been simulated, the advanced test performs an aggregate logit (MNL) run.

²¹ SSI Web Documentation, 2011, Software for Web Interviewing and Conjoint Analysis, p347, Sawtooth Inc.

Figure 1.2.1a: Domestic unplanned design statistics

Task generation method is 'Complete Enumeration' using a seed of 1. Based on 27 version(s). Includes 162 total choice tasks (6 per version). Each choice task includes 2 concepts and 3 attributes. A Priori Estimates of Standard Errors for Attribute Levels _____ Att/Lev Freq. Actual Ideal Effic. 1 1 65 (this level has been deleted) 1 1 2 64 0.2236 0.2222 0.9875 2 1 3 65 0.2232 0.2222 0.9917 3
 1
 5
 65
 0.2232
 0.2222
 0.9917
 5

 1
 4
 65
 0.2249
 0.2222
 0.9762
 4

 1
 5
 65
 0.2229
 0.2222
 0.9940
 5
 164 (this level has been deleted) 1265 0.2230 0.2222 0.9928 2365 0.2261 0.2222 0.9660 3465 0.2195 0.2222 1.0247 4565 0.2349 0.2222 0.8947 5 2 2 2 2 2

 3
 1
 65 (this level has been deleted) 1

 3
 2
 65 0.2217 0.2222 1.0048 2

 3
 3
 64 0.2285 0.2222 0.9459 3

 3
 4
 65 0.2270 0.2222 0.9582 4

 5 65 0.2201 0.2222 1.0193 5 3

The column labelled 'actual' gives estimated standard errors for the data file analysed and the column labelled 'ideal' gives an estimate of what those standard errors would be if the design were precisely orthogonal and had the same number of observations.

The column labelled 'effic' gives the relative efficiency of this design in terms of estimating each parameter, compared to the hypothetical orthogonal design (it is the square of their ratio).

All the results here lie within the range 0.9 to 1.1, suggesting a good level of efficiency. The table of two-way frequencies also illustrates a well balanced design.

Two-Way Fre	quencies														
Att/lev	1/1	1/2	1/3	1/4	1/5	2/1	2/2	2/3	2/4	2/5	3/1	3/2	3/3	3/4	3/5
1/1	65	0	0	0	0	13	13	13	13	13	13	13	13	13	13
1/2	0	64	0	0	0	12	13	13	13	13	13	14	12	12	13
1/3	0	0	65	0	0	13	13	13	13	13	13	13	13	13	13
1/4	0	0	0	65	0	13	13	13	13	13	13	13	13	13	13
1/5	0	0	0	0	65	13	13	13	13	13	13	12	13	14	13
2/1	13	12	13	13	13	64	0	0	0	0	13	13	13	13	12
2/2	13	13	13	13	13	0	65	0	0	0	13	13	13	13	13
2/3	13	13	13	13	13	0	0	65	0	0	13	12	12	14	14
2/4	13	13	13	13	13	0	0	0	65	0	13	14	13	12	13
2/5	13	13	13	13	13	0	0	0	0	65	13	13	13	13	13
3/1	13	13	13	13	13	13	13	13	13	13	65	0	0	0	0
3/2	13	14	13	13	12	13	13	12	14	13	0	65	0	0	0
3/3	13	12	13	13	13	13	13	12	13	13	0	0	64	0	0
3/4	13	12	13	13	14	13	13	14	12	13	0	0	0	65	0
3/5	13	13	13	13	13	12	13	14	13	13	0	0	0	0	65

Figure 1.2.1b: Domestic unplanned advanced design statistics

Logit Report with Simulated Data Main Effects: 1 2 3 Build includes 3000 respondents. Total number of choices in each response category: Category Number Percent 1 8574 47.63% 2 8532 47.40% 3 894 4.97% There are 18000 expanded tasks in total, or an average of 6.0 tasks per respondent. 1 Log-likelihood = -16364.30783 Chi Sq = 6821.42674 RLH = 0.40288 Iter Iter 2 Log-likelihood = -15591.18915 Chi Sq = 8367.66410 RLH = 0.42056 Iter 3 Log-likelihood = -15429.98600 Chi Sq = 8690.07039 RLH = 0.42434 4 Log-likelihood = -15408.72690 Chi Sq = 8732.58858 RLH = 0.42484 Iter 5 Log-likelihood = -15407.16479 Chi Sq = 8735.71282 RLH = 0.42488 Iter 6 Log-likelihood = -15407.08859 Chi Sq = 8735.86521 RLH = 0.42488 Iter 7 Log-likelihood = -15407.08540 Chi Sq = 8735.87159 RLH = 0.42488 Iter 8 Log-likelihood = -15407.08527 Chi Sq = 8735.87185 RLH = 0.42488 Iter Iter 9 Log-likelihood = -15407.08526 Chi Sq = 8735.87186 RLH = 0.42488 *Converged t Ratio Attri 0.15291 1 1 1 Effect Std Err Attribute Level 0.00292 0.01912 1
 0.0249
 0.01944
 1.25953

 -0.03079
 0.01914
 -1.60874

 -0.00553
 0.01919
 -0.28819

 0.00890
 0.01920
 0.46364
 1.25953 1 2 2 -1.60874 1 3 3 2 3 144 4 5 155
 0.01919
 0.01942

 -0.01082
 0.01923

 -0.03375
 0.01926

 0.01192
 0.01913
 0.98803 -0.56277 211 6 7 222 -1.75294 2 3 3 8 0.62337 244 9

10	0.01346	0.01929	0.69803	255	
11	-0.00833	0.01922	-0.43355	311	
12	0.02386	0.01914	1.24631	322	
13	-0.02306	0.01937	-1.19023	333	
14	0.00782	0.01921	0.40687	344	
15	-0.00028	0.01918	-0.01478	355	
16	-2.25821	0.03431	-65.82431	NONE	

The strength of design for this model is 3262.28901

The data in the Effect (utilities) and T-ratio columns are not relevant, as the test is using random data. The important column is the Aggregate Std Err (standard error) column. The standard errors reflect the precision obtained for each parameter. Lower error means greater precision.

This design included no prohibitions, so the standard errors are quite uniform within each attribute. The levels within four-level attributes all have standard errors around 0.019.

Suggested guidelines are:

- Standard errors within each attribute should be roughly equivalent
- Standard errors for main effects should be no larger than about 0.05
- Standard errors for interaction effects should be no larger than about 0.10.

The second two criteria are Sawtooth's 'rules of thumb' based on experience with many different data sets and recommendations regarding minimum sample sizes and minimum

acceptable precision²². The standard errors here are within the recommended value for main effects.

Figure 1.2.2a: SME unplanned design statistics

Task generation method is 'Complete Enumeration' using a seed of 1. Based on 9 version(s). Includes 54 total choice tasks (6 per version). Each choice task includes 2 concepts and 3 attributes.

A Priori Estimates of Standard Errors for Attribute Levels

Att/	Lev	Freq.	Actual	Ideal	Effic.	
1	1	22	(this lev	el has bee	en deleted)	1
1	2	22	0.3952	0.3849	0.9486	2
1	3	21	0.4023	0.3849	0.9155	3
1	4	21	0.4019	0.3849	0.9173	4
1	5	22	0.3932	0.3849	0.9581	5
2	1	22	(this lev	el has bee	en deleted)	1
2	2	21	0.4149	0.3849	0.8605	2
2	3	22	0.4042	0.3849	0.9068	3
2	4	21	0.3705	0.3849	1.0790	4
2	5	22	0.4401	0.3849	0.7648	5
3	1	22	(this lev	el has bee	en deleted)	1
3	2	21	0.3883	0.3849	0.9827	2
3	3	21	0.4094	0.3849	0.8838	3
3	4	22	0.4032	0.3849	0.9114	4
3	5	22	0.3846	0.3849	1.0015	5

The column labelled 'effic' gives the relative efficiency of this design in terms of estimating each parameter, compared to the hypothetical orthogonal design (it is the square of their ratio).

All the results here lie within the range 0.7 to 1.1, suggesting a reasonable level of efficiency for most attributes but relatively lower efficiency for the top level of the second attribute (frequency of outage). The table of two-way frequencies also illustrates a well balanced design.

Two-Way Free	Aay Frequencies														
Att/Lev	1/1	1/2	1/3	1/4	1/5	2/1	2/2	2/3	2/4	2/5	3/1	3/2	3/3	3/4	3/5
1/1	22	0	0	0	0	4	4	4	5	5	5	4	5	4	4
1/2	0	22	0	0	0	4	5	5	4	4	4	5	4	4	5
1/3	0	0	21	0	0	4	4	5	4	4	4	4	4	5	4
1/4	0	0	0	21	0	5	4	4	4	4	4	4	4	4	5
1/5	0	0	0	0	22	5	4	4	4	5	5	4	4	5	4
2/1	4	4	4	5	5	22	0	0	0	0	4	5	4	4	5
2/2	4	5	4	4	4	0	21	0	0	0	4	4	4	5	4
2/3	4	5	5	4	4	0	0	22	0	0	5	4	4	5	4
2/4	5	4	4	4	4	0	0	0	21	0	4	4	4	4	5
2/5	5	4	4	4	5	0	0	0	0	22	5	4	5	4	4
3/1	5	4	4	4	5	4	4	5	4	5	22	0	0	0	0
3/2	4	5	4	4	4	5	4	4	4	4	0	21	0	0	0

²² Sawtooth SSI Web, p352

Figure 1.2.2b: SME unplanned advanced design statistics

Logit Report with Simulated Data _____ Main Effects: 1 2 3 Build includes 1000 respondents. Total number of choices in each response category: Category Number Percent _____ 1 2766 46.10% 2 2921 48.68% 3 313 5.22% There are 6000 expanded tasks in total, or an average of 6.0 tasks per respondent. Iter 1 Log-likelihood = -5469.32429 Chi Sq = 2244.69888 RLH = 0.40190 2 Log-likelihood = -5220.48972 Chi Sq = 2742.36802 RLH = 0.41892 Iter 3 Log-likelihood = -5170.13347 Chi Sq = 2843.08051 RLH = 0.42245 Iter Iter 4 Log-likelihood = -5163.76704 Chi Sq = 2855.81338 RLH = 0.42290 5 Log-likelihood = -5163.31679 Chi Sq = 2856.71389 RLH = 0.42293 Iter Iter 6 Log-likelihood = -5163.29522 Chi Sq = 2856.75703 RLH = 0.42293 Iter 7 Log-likelihood = -5163.29432 Chi Sq = 2856.75883 RLH = 0.42293 Iter 8 Log-likelihood = -5163.29428 Chi Sq = 2856.75890 RLH = 0.42293 Iter 9 Log-likelihood = -5163.29428 Chi Sq = 2856.75891 RLH = 0.42293 *Converged
 Effect
 Std Err
 t Ratio
 Attribute Level

 0 03420
 0 03330
 1 02699
 1 1 1
 Effect

1	0.03420	0.03330	1.02699	111	
2	-0.04084	0.03439	-1.18758	122	
3	0.05746	0.03487	1.64784	133	
4	-0.03315	0.03586	-0.92432	144	
5	-0.01767	0.03480	-0.50759	155	
6	-0.02197	0.03440	-0.63878	211	
7	0.02579	0.03558	0.72476	222	
8	0.03871	0.03404	1.13728	233	
9	-0.03445	0.03583	-0.96144	244	
10	-0.00808	0.03503	-0.23070	255	
11	0.03346	0.03392	0.98654	311	
12	-0.07741	0.03391	-2.28276	322	
13	0.02372	0.03449	0.68779	333	
14	-0.01751	0.03349	-0.52278	344	
15	0.03773	0.03313	1.13876	355	
16	-2.20554	0.05806	-37.98400	NONE	

The strength of design for this model is 1053.34857

The standard errors here are within the recommended value for main effects (0.05).

Figure 1.2.3a: Domestic planned design statistics

Task generation method is 'Complete Enumeration' using a seed of 1. Based on 27 version(s). Includes 162 total choice tasks (6 per version). Each choice task includes 2 concepts and 4 attributes. A Priori Estimates of Standard Errors for Attribute Levels _____ Att/Lev Freq. Actual Ideal Effic. 1 1 81 (this level has been deleted) 1 810.18930.19251.03362810.19870.19250.93803 1 2 3 1 1 4 81 0.1954 0.1925 0.9699 4 2 1 81 (this level has been deleted) 1 2 2 81 0.1892 0.1925 1.0342 2 2 3 81 0.2009 0.1925 0.9181 З 2 4 81 0.1954 0.1925 0.9695 4 1108 (this level has been deleted) 12108 0.1585 0.1571 0.9826 23108 0.1591 0.1571 0.9750 3 3 3 3 4 65 (this level has been deleted) 1 1 4 2 64 0.2325 0.2222 0.9132 2 65 0.2255 0.2222 0.9709 4 3 3 1.0401 65 0.2179 0.2222 4 4 4 65 0.2239 0.2222 0.9850 5 4 5

The column labelled 'effic' gives the relative efficiency of this design in terms of estimating each parameter, compared to the hypothetical orthogonal design (it is the square of their ratio).

All the results here lie within the range 0.9 to 1.1, suggesting a good level of efficiency. The table of two-way frequencies also illustrates a well-balanced design.

Two-Way Fre	quencies															
Att/Lev	1/1	1/2	1/3	1/4	2/1	2/2	2/3	2/4	3/1	3/2	3/3	4/1	4/2	4/3	4/4	4/5
1/1	81	0	0	0	20	20	21	20	26	28	27	17	15	17	16	16
1/2	0	81	0	0	20	21	20	20	28	26	27	16	17	16	16	16
1/3	0	0	81	0	21	20	20	20	27	27	27	16	16	16	17	16
1/4	0	0	0	81	20	20	20	21	27	27	27	16	16	16	16	17
2/1	20	20	21	20	81	0	0	0	27	28	26	16	16	16	17	16
2/2	20	21	20	20	0	81	0	0	28	26	27	16	16	16	16	17
2/3	21	20	20	20	0	0	81	0	26	27	28	17	16	17	16	15
2/4	20	20	20	21	0	0	0	81	27	27	27	16	16	16	16	17
3/1	26	28	27	27	27	28	26	27	108	0	0	22	22	21	21	22
3/2	28	26	27	27	28	26	27	27	0	108	0	22	21	22	22	21

Figure 1.2.3b: Domestic planned advanced design statistics

Logit Report with Simulated Data _____ Main Effects: 1 2 3 4 Build includes 1500 respondents. Total number of choices in each response category: Category Number Percent _____ -----1 4276 47.51% 2 4278 47.53% 3 446 4,96% There are 9000 expanded tasks in total, or an average of 6.0 tasks per respondent. 1 Log-likelihood = -8173.57313 Chi Sq = 3427.87494 RLH = 0.40326 Iter 2 Log-likelihood = -7786.71658 Chi Sq = 4201.58803 RLH = 0.42097 Iter 3 Log-likelihood = -7705.97162 Chi Sq = 4363.07796 RLH = 0.42477 Iter Iter 4 Log-likelihood = -7695.30753 Chi Sq = 4384.40614 RLH = 0.42527 5 Log-likelihood = -7694.52287 Chi Sq = 4385.97546 RLH = 0.42531 Iter 6 Log-likelihood = -7694.48457 Chi Sq = 4386.05206 RLH = 0.42531 Iter 7 Log-likelihood = -7694.48296 Chi Sq = 4386.05527 RLH = 0.42531 Iter 8 Log-likelihood = -7694.48290 Chi Sq = 4386.05540 RLH = 0.42531 9 Log-likelihood = -7694.48290 Chi Sq = 4386.05540 RLH = 0.42531 Iter Iter *Converged Std Err t Ratio Effect Attribute Level
 -0.00994
 0.02291
 -0.43414
 1
 1

 -0.04004
 0.02279
 -1.75672
 1
 2
 2

 0.02937
 0.02300
 1.27681
 1
 3
 3
 1 2 3 4 0.02062 0.02278 0.90501 144
 0.01363
 0.02295
 0.59393
 2
 1
 1

 -0.00080
 0.02312
 -0.03471
 2
 2
 2

 -0.02053
 0.02291
 -0.89609
 0
 0
 0
 0

 0.00770
 0.000770
 0.000770
 0.000770
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 0
 0
 0
 0
 5 6 7 8
 0.01771
 -1.74471
 3 1 1

 0.01765
 1.23475
 3 2 2

 0.01771
 0.51485
 3 3 3
 9 -0.03090 10 0.02179 0.00912 11 0.02731 0.02730 0.02721 -1.10990 3.15949 12 -0.03031 411 422 13 0.08625

-0.74793 -0.02028 0.02712 444 15 16 -0.03414 0.02728 -1.25156 455 17 -2.26039 0.04857 -46.53916 NONE

-0.05596 4 3 3

-0.00152

14

The standard errors here are within the recommended value for main effects (0.05).

Figure 1.2.4a: SME planned design statistics

Task generation method is 'Complete Enumeration' using a seed of 1. Based on 9 version(s). Includes 54 total choice tasks (6 per version). Each choice task includes 2 concepts and 4 attributes.

A Priori Estimates of Standard Errors for Attribute Levels

Att/	Lev	Freq.	Actual	Ideal	Effic.	
1	1	27	(this lev	el has bee	en deleted)	1
1	2	27	0.3316	0.3333	1.0106	2
1	3	27	0.3589	0.3333	0.8626	3
1	4	27	0.3576	0.3333	0.8687	4
2	1	27	(this lev	el has bee	en deleted)	1
2	2	27	0.3501	0.3333	0.9067	2
2	3	27	0.3633	0.3333	0.8417	3
2	4	27	0.3485	0.3333	0.9148	4
3	1	36	(this lev	el has bee	en deleted)	1
3	2	36	0.2783	0.2722	0.9567	2
3	3	36	0.2780	0.2722	0.9582	3
4	1	22	(this lev	el has bee	en deleted)	1
4	2	22	0.4117	0.3849	0.8740	2
4	3	21	0.3769	0.3849	1.0428	3
4	4	21	0.3930	0.3849	0.9593	4
4	5	22	0.4089	0.3849	0.8862	5

The column labelled 'effic' gives the relative efficiency of this design in terms of estimating each parameter, compared to the hypothetical orthogonal design (it is the square of their ratio).

All the results here lie within the range 0.8 to 1.1, suggesting a reasonable level of efficiency. The table of two-way frequencies also illustrates a well-balanced design.

Two-Way Free	quencies															
Att/Lev	1/1	1/2	1/3	1/4	2/1	2/2	2/3	2/4	3/1	3/2	3/3	4/1	4/2	4/3	4/4	4/5
1/1	27	0	0	0	6	7	7	7	9	9	9	6	6	5	5	5
1/2	0	27	0	0	7	6	7	7	9	9	9	4	5	6	6	6
1/3	0	0	27	0	7	7	7	6	9	9	9	6	5	5	5	6
1/4	0	0	0	27	7	7	6	7	9	9	9	6	6	5	5	5
2/1	6	7	7	7	27	0	0	0	8	9	10	5	6	6	5	5
2/2	7	6	7	7	0	27	0	0	9	9	9	5	6	5	5	6
2/3	7	7	7	6	0	0	27	0	9	9	9	6	5	5	6	5
2/4	7	7	6	7	0	0	0	27	10	9	8	6	5	5	5	6
3/1	9	9	9	9	8	9	9	10	36	0	0	7	7	7	7	8
3/2	9	9	9	9	9	9	9	9	0	36	0	7	8	7	7	7

Figure 1.2.4b: SME planned advanced design statistics

Logit Report with Simulated Data _____ Main Effects: 1 2 3 4 Build includes 500 respondents. Total number of choices in each response category: Category Number Percent _____ 1493 49.77% 1 1366 45.53% 2 3 141 4.70% There are 3000 expanded tasks in total, or an average of 6.0 tasks per respondent. Iter 1 Log-likelihood = -2710.73397 Chi Sq = 1170.20578 RLH = 0.40512 Iter 2 Log-likelihood = -2577.38380 Chi Sq = 1436.90614 RLH = 0.42353 Iter 3 Log-likelihood = -2548.70316 Chi Sq = 1494.26740 RLH = 0.42760 4 Log-likelihood = -2544.74707 Chi Sq = 1502.17959 RLH = 0.42816 Iter 5 Log-likelihood = -2544.44378 Chi Sq = 1502.78616 RLH = 0.42821 Iter 6 Log-likelihood = -2544.42868 Chi Sq = 1502.81637 RLH = 0.42821 Iter Iter 7 Log-likelihood = -2544.42804 Chi Sq = 1502.81765 RLH = 0.42821 8 Log-likelihood = -2544.42802 Chi Sq = 1502.81770 RLH = 0.42821 Iter Iter 9 Log-likelihood = -2544.42802 Chi Sq = 1502.81770 RLH = 0.42821 *Converged Std Err Effect t Ratio Attribute Level
 Effect
 Std Err
 t Katlo

 0.00425
 0.04090
 0.10387

 -0.05491
 0.04151
 -1.32264

 0.05818
 0.04000
 1.45457
 1 111 2 122 3 133 0.04124 -0.00752 -0.18247 4 144 0.04189 -0.88513 0.04081 0.44521 0.04036 1.20460 5 -0.03707 211 0.01817 222 6 7 0.04861 233 8 -0.02971 0.04005 -0.74192 244 0.03099 0.73678 0.03075 1.13758 0.03081 1.0755 9 0.02283 311 10 0.03499 322 0.03081 11 -0.05782 -1.87632 3 3 3 0.04721 0.05412 12 1.14616 4 1 1 13 -0.00779 -0.16072 422 0.05056 0.04888 0.04890 -0.05128 4 3 3 14 -1.01423 15 -0.02638 -0.53976 444 0.03133 0.04890 0.64080 16 455

The standard errors here are within the recommended value for main effects (0.05).

NONE

0.08627 -26.82712

17

-2.31444

ANNEX 1.3: ALTERNATIVE MODEL SPECIFICATIONS

A range of model forms were tested using logistic regression. The model forms are summarised in Figure 1.3.1. Figures 1.3.2 and 1.3.3 summarise the outputs.

Model	Form
1	Uj = a0 + b1j * duration + b2j * frequency + cj * price + d * (don't know)
2	Uj = b1j * duration + b2j * frequency + cj * price + d * (don't know)
3	Uj = b1j * duration + b2j * frequency + b2j * (duration * frequency) + cj * price + d * (don't know)
4	$ \begin{array}{l} Uj = a0 + b1j * \ln(duration) + b2j * (\ln(duration) * freq2 - 3) + b3j * \\ (\ln(duration) * freq4 - 6) + b4j * (\ln(duration) * freq7 - 14) + b5j * \\ (\ln(duration) * freq15 +) + cj * price + d * (don't know) \end{array} $
5	$ \begin{array}{l} Uj = \\ b1j*\ln(duration) + b2j*(\ln(duration)*freq2-3) + b3j*(\ln(duration)*freq4-6) + b4j*(\ln(duration)*freq7-14) + b5j*(\ln(duration)*freq15+) + cj*price + d*(don't know) \end{array} $
6	$\begin{array}{l} Uj = a0 + b1j*\ln(duration) + b1bj*frequency + b2j*(\ln(duration)*\\ freq2 - 3) + b3j*(\ln(duration)*freq4 - 6) + b4j*(\ln(duration)*freq7 - 14) + b5j*(\ln(duration)*freq15 +) + cj*price + d*(don't know) \end{array}$
7	$\begin{array}{l} Uj = b1j*\ln(duration) + b1bj*frequency + b2j*(\ln(duration)*freq2 - \\ 3) + b3j*(\ln(duration)*freq4 - 6) + b4j*(\ln(duration)*freq7 - 14) + \\ b5j*(\ln(duration)*freq15 +) + cj*price + d*(don't know) \end{array}$

Model 5 was selected for the following reasons:

- The coefficients have the expected signs and order of magnitude the coefficient for the '2-3 times' frequency, though positive, is not significantly different from zero
- The models perform relatively well for both domestic and SME
- The approach is consistent with the model form used in the LE study, when the pilot surveys included frequency.

Figure 1.3.2: Logistic regression models – domestic WTA unplanned

		MODE	L 1			MOI	DEL 2			MO	DEL 3			MOE	DEL 4			MOL	DEL 5			MOI	DEL 6			МОГ	DEL 7	
	DURATION	(LN), FREQUEN	NCY, PRICE, C	ONSTANT	DURATIO	ON (LN), FR CON	EQUENCY, STANT	PRICE, NO	DURATIO (LN) * FRE	N (LN), FR QUENCY,	EQUENCY, PRICE, NO	DURATION CONSTANT	DURA FREQU	TION (LN), ENCY (0,1 CONS	DURATION DUMMIES) STANT	I (LN) * , PRICE,	DUR/ FREQUE	ATION (LN), NCY (0,1 D CON	DURATION JMMIES), F STANT	I (LN) * PRICE, NO	DURATIC (LN) * FRE	IN (LN), FRI QUENCY (I NO CO	EQUENCY, D),1 DUMMI NSTANT	URATION ES), PRICE,	DURATIO (LN) * DUMI	N (LN), FRE (REDUCED) VIES), PRIC	QUENCY, E FREQUEN E, NO CON	URATION CY (0,1 STANT
	P	с F	Wold	Cia	P	e e	Wold	Cia	P	с F	Wold	Cia	P	e e	Wold	Cia	P	e e	Wold	Cia	P	e e	Wold	Cia	P	8 F	Wold	Cia
l p(duration) (1 20 120 240 960)	-0.2085	0.0046	2070.8	0.0000	-0.1744	0.0029	2 2057 2	3ig.	-0.1460	0.004	976	3 0.0000	-0.1616	0.0062	674 A	3iy.	-0.155/	0.0057	755 1	0.0000	-0.1634	0.0059	901 Q	0.0000	-0.1609	0.004C	1500 1	0.0000
Enguency (1, 2,5, 5, 10,5, 15)	-0.0578	0.0040	770 /	0.0000	-0.1/44	0.0016	5 5 80 7	0.0000	-0.1400	0.004	0 50	8 0.0000	-0.1010	0.0002	074.4	0.0000	0.0000	0.0000	735.1	0.0000	-0.1034	0.0030	62.2	0.0000	-0.1005	0.0040	77.1	0.0000
Bill Compensation (£1 £5 £10 £12 £15)	0.0606	0.0021	816.0	0.0000	0.0779	0.0017	2 20/11	0.0000	0.0232	0.0030	0 1/19	2 0.0000	0.0603	0.0021	806.0	0.0000	0.0636	0.0016	1515 /	0.0000	0.0233	0.0030	1/11 8	0.0000	0.0245	0.0028	1/92 5	0.0000
I n(duration) * Frequency (events per 3 years)	0.0000	0.0021	0.0	0.0000	0.0000	0.0017	2041.0	0.0000	-0.0067	0.001	7 80	7 0.0000	0.0000	0.0021	000.0		0.0000	0.0010	1515.4	0.0000	0.0010	0.0013	1411.0	0.0000	0.0010	0.0015	1402.5	0.0000
In(duration) * freq2 3 (2-3 times in 3 years)	0.0000				0.0000				0.0000	0.0000	0 0	0 00000	0.0059			0 3981	0.0057		0.7	0.4166	0.0112		2 5		0.0000			
In(duration) * freq4_6 (4-6 times in 3 years)	0.0000				0.0000				0.0000		0 0		-0.0249	0.0072	11 0	0.0006	-0.0236	0.0072	10.7	0.0011	-0.0037		0.2		0.0000			
In(duration) * freq7-14 (7 to 14 times in 3 years)	0.0000	0.0000		0.0000	0.0000			0.0000	0.0000		0 0	0 0.0000	-0.1161	0.0074	248 5	0,0000	-0.1159	0.0074	247 3	0.0000	-0.0738	0.0091	66.2	0.0000	-0.0752	0.0073	104.9	0.0000
In(duration) * freq15+ (15 or more times in 3 years)	0.0000	0.0000		0.0000	0.0000			0.0000	0.0000		0 0	0 0.0000	0.1262	0.0075	220.3	0.0000	0.1251	0.0075	226 5	0.0000	0.0601	0.0000	20.6	0.0000	0.0505	0.0003	EC 7	0.0000
Erog2 3 (2 2 times in 2 years)	0.0000	0.0000		0.0000	0.0000		0.0	0.0000	0.0000		0 0.	0.0000	-0.1302	0.0075	550.5	0.0000	-0.1333	0.0075	520.5	0.0000	-0.0051	0.0111		0.0000	-0.0050	0.0000	50.7	0.0000
Freq2_3 (2-3 times in 3 years)	0.0000			0.0000	0.0000		0.0		0.0000		0 0.		0.0000		0.0	0.0000	0.0000			0.0000	0.0000		0.0	0.0000	0.0000			
Freq4_6 (4-6 times in 3 years)	0.0000	0.0000		0.0000	0.0000		0.0	0.0000	0.0000		0 0.	0 0.0000	0.0000		0.0	0.0000	0.0000			0.0000	0.0000			0.0000	0.0000			
Freq7-14 (7 to 14 times in 3 years)	0.0000			0.0000	0.0000				0.0000		0 0.	0 0.0000	0.0000		0.0	0.0000	0.0000			0.0000	0.0000				0.0000			
Freq15+ (15 or more times in 3 years)																												
Constant	0.4222	0.0302	195.8	0.0000									0.0638	0.0268	5.7	0.0172												
Don't know	-2.3425	0.0368	4057.0	0.0000	-1.9203	0.0210	8339.9	0.0000	-1.9203	0.0210	0 8339.	9 0.0000	-1.9841	0.0340	3396.2	2 0.0000	-1.9203	0.0210	8339.9	0.0000	-1.9203	0.0210	8339.9	0.0000	-1.9203	0.0210	8339.9	0.0000
Nagelkerke R Square	21.7				32.6				32.7				21.4				32.6	5			32.8				32.7			
Overall % correct	72.1				71.9				72.0				71.8				71.8	5			72.1				72.1			
% Chosen correct	43.2				37.8				41.0				44.4				44.4				42.3				42.3			
	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper
1.0 hrs duration, once every 3 years	£11.27	£25,021	£23,167	£26,875	£7.27	£16,150	£15,239	£17,061	£6.77	£15,030	8 £13,88	5 £16,191	£8.02	£17,814	£15,992	£19,636	£7.32	£16,257	£14,838	£1/,6//	£7.23	£16,048	£14,722	£17,374	£7.09	£15,740	£14,682	£16,798
1.0 hrs duration, 2-3 times in 3 years	£12.70	£28,199	£26,345	£30,053	£8.13	£18,055	5 £17,144	£18,967	£7.68	£17,06:	3 £15,91	1 £18,216	£8.02	£17,814	£14,729	£20,899	£7.32	£16,257	£13,553	£18,962	£7.73	£17,165	£14,707	£19,631	£7.61	£16,897	£15,840	£17,955
1.0 hrs duration, 4-6 times in 3 years	£15.08	£33,495	£31,641	£35,349	£9.56	£21,231	£20,320	£22,142	£9.20	£20,435	9 £19,28	6 £21,592	£9.26	£20,564	£17,330	£23,798	£8.43	£18,724	£15,923	£21,524	£8.57	£19,037	£16,444	£21,630	£8.48	£18,826	£17,769	£19,884
1.0 hrs duration, 7-14 (7 to 14 times in 3 years	£19.85	£44,088	£42,234	£45,942	£12.42	£27,581	£26,670	£28,492	£12.24	£27,190	0 £26,03.	/ £28,343	£13.79	£30,615	£26,997	£34,232	£12.78	£28,380	£25,351	£31,409	£13.37	£29,682	£26,723	£32,641	£13.37	£29,681	£27,327	£32,036
1.0 hrs duration, 15 of more times in 3 years	£24.62	£54,081	£52,827	£50,535	£15.28	£33,932	£33,020	£34,843	£15.28	£33,94.	1 £32,78	9 £35,094	£14.78	132,827	£29,096	£30,558	£13.05	E30,398	£27,300	£33,496	£14.85	£32,984	£29,681	£30,287	£14.87	£33,020	£30,365	£35,675
6.0 hrs duration, once every 3 years	£17.44	£38,/19 £41.907	£35,750	£41,082	£11.28	£25,050	£23,594	£20,500	£10.03	£23,590	8 £21,750	1 C20 026	£12.82	£28,409	£25,557	£31,381	£11.70	£25,981	£23,/13	£28,249	£11.35	£25,195	£23,080	£27,318	£11.12	£24,092	£23,002	£20,383
6.0 hrs duration, 4.6 times in 3 years	£10.07	£47,057	£30,934	£44,000	£12.14	£20,555	C20 675	£20,411	£12.73	620,10	2 524,54	0 622 225	£14.80	£23,405	£23,339	£35,599	£12.47	£20,000	£21,030	£30,304	£12.60	£20,520	£22,505	£30,233	£12.51	£23,830	£24,139	£27,540
6.0 hrs duration, 4=0 times in 5 years	£21.23	£47,133	£44,250	£50,157	£15.37	£36 491	625,075	£31,307	£17.61	£20,45	2 120,030	0 £32,333	£14.00	£49.005	E27,090	£50,051	£10.47	E 4E 2E 4	£25,447	£54,597	£10.25	£42.066	£24,044	E32,332	£10.30	£43.91C	£20,089	£29,409
6.0 hrs duration, 7=14 (7 to 14 times in 3 years	£20.02	£59,780	E 34,023	£00,749	£10.43	£43 931	C41 275	£37,337	£17.01	£47 72	0 57,200	6 C40 571	622.03	£53 461	E45,144	£34,707	£20.42	£49,534	£40,514	£50,195 (52,520	£19.33	£42,500	E 50,237	£47,095	£19.28	E42,019	£39,033	£40,362
12.0 hrs duration, 15 of more times in 5 years	£10.79	£44.019	£05,415	E71,542	£13.23	£39.403	L E41,575	£44,207	£12.49	£96.010	0 £43,000	D E49,371	£14.69	£32,401	. E40,498	£30,425	£12.00	£20 742	£45,020	£33,329 £33,329	£12.04	£40,000	£40,750	£31,200	£13.69	£43,040	£41,005	£30,089
12.0 hrs duration, once every 5 years	£19.82	£44,018	£40,020	£47,410	£12.65	£20,493	C20,020	£30,100	£12.12	620,910	0 £24,60.	2 621 820	£14.00	622,001	C26 047	£33,923	£13.35	620 742	£27,140	£32,339	£12.54	£20,755	6 626,313	£31,103	£12.08	620,213	£20,221	C21 249
12.0 hrs duration, 2-5 times in 3 years	622.64	£52 492	£40,004	150,500	£15.03	£22 574	£21 007	£25 240	£15.30	634 38	2 £27,00.	2 626 401	£16.04	£37 621	£21 706	£42 527	£15.03	624 254	£20 122	£20 277	£14.20	£21 729	6 676 094	£26 A72	£14.07	621 247	£20 207	£22 177
12.0 hrs duration, 7-14/7 to 14 times in 2 years	£28.04	£52,452	£49,100	E33,003	£17.02	£20.024	(20.257	£33,240	£10.60	£42 72	2 52,27	2 645 921	£25.22	£56,000	E31,700	£45,557	£13.43	£54,234	£29,152	£39,377	£ 21 66	£49 105	C42 601	£30,472	£21 57	£47.001	£29,507	£55,177
12.0 hrs duration, 7-14 (7 to 14 times in 3 years	£22.10	£73 679	£70 295	677.070	£20.94	£35,524	E E E E E E E E E E E E E E E E E E E	£41,331 £47.041	£23.09	£53.061	2 550.05	2 £55 171	£27.04	£60.056	£52 224	£66 991	£25.00	£55,613	£40,580	£61 270	£22.00	651.046	E42,091	£57.089	£22.57	£50 805	£45,593	152,209
12.0 hrs duration, 15 or more times in 3 years	£24 F0	£54.616	£50 266	£77,070	£20.84	£40,274	£22 201	£47,941	£23.89 £15.10	£22.52	2 £20,95	0 £26.175	£27.04	£40 825	£26 650	£45.012	£25.04	£27.244	£49,944	£40 510	£22.99	£35,040	£22 700	£29.960	£15 90	£35,001	£43,951	£33,005
48.0 hrs duration 2-2 times in 2 years	£26.02	£57 704	£52 544	£62.04F	£16.70	627 204	£25 100	£20 272	£16.56	£26 76	2 E30,890	5 £20 110	£18.39	£40,035	£22 762	£43,012	£16.78	£37,200	£21 0CC	£40,519	£16.54	636 041	£21 207	£42 584	£15.80	636.240	£32,058	£29 664
48.0 hrs duration 4.6 times in 2 years	£28.41	£57,794 £63.001	£50 040	£67 241	£18.22	£40 AFC	£20 274	£33,373 £43 549	£18.00	£42 160	0 £20 54	9 EAA 902	£21.23	£47 120	£20 775	£54,500	£10.78	£42 010	£26 500	£40,400	£17.49	£30,541	£27.96F	£42,304	£17.10	£39 160	£25,015	£40 504
48.0 hrs duration, 7-14 /7 to 14 times in 2 years	622.18	673 683	£60 A22	677 024	621.08	£46 810	EAA 721	£42,340	623.84	£52 QA	1 650 20	2 £55 597	631.60	£70 176	£61 992	679 460	£20.30	£65.054	£59 112	£71 007	£17.40	£59 292	£51 600	£65 166	£17.19 £26.15	£58.065	£57.667	£62 A62
49.0 hrs duration, 7-14 (7 to 14 times in 3 years	627.05	£04 276	£09,455	£00 537	622.04	£52 160	CE1.073	L40,030	629.70	£62 720	0 661.00	6 666 271	£32.00	£75 247	LU1,005	£70,409	£21.30	£60,670	662 570	676 790	627.52	£61 122	151,000	CCR C02	627.25	£60 721	LJ2,007	203,403
40.0 ms duration, 15 or more times in 3 years	137.95	104,270	180,025	100,527	£23.94	133,100	J E31,072	133,249	128.70	103,723	5 £01,080	D 100,371	£33.89	£/3,24/	100,095	105,799	131.30	109,679 L	102,578	1/0,/80	127.52	101,123	123,332	100,093	127.35	100,732	134,040	100,818

Figure 1.3.3: Logistic regression models – SME WTA unplanned

		MODEL 1 URATION (LN), FREQUENCY, PRICE, CONSTANT DURATION		MODE	L 2			MODE	EL 3			MOD	EL 4			MOD	EL 5			MODE	L 6		МС	DEL 7			MOL	IEL 8			
	DURATIO	IN (LN), FREQUENC	Y, PRICE, CONS	TANT	DURATIO	ON (LN), FREQUENC	Y, PRICE, NO CO	INSTANT	DURATION (N), FREQUENCY, D PRICE, NO C	URATION (LN) * DNSTANT	FREQUENCY,	DURATION (LI	N), DURATION (LN) PRICE, CO	* FREQUENCY (I NSTANT	0,1 DUMMIES),	DURAT	ION (LN), DURATION DUMMIES), PRICE	N (LN) * FREQUENC E, NO CONSTANT	Y(0,1	DURATION (I	N), FREQUENCY, DL 1 DUMMIES), PRIC	IRATION (LN) * FREQUENC E, NO CONSTANT	FRI	ON (LN), FREQUENO QUENCY (0,1 DUMP	.Y, DURATION WES), PRICE,	N (LN) * (REDUCED) NO CONSTANT	DURATION	(LN), DURATION (LN (REDUCED) PRIC) * FREQUENCY (0, E, NO CONSTANT	2 DUMMIES),
	в	SE	Wald	Sig	в	S.F.	Wald	Sig	B	SE	Wald	Sin	в	SF	Wald	Sig	B	SE	Wald	Sig	B	SF	Wald Sig	B	SE	w	ald Sig	B	SE	Wald	Sin
Lo(duration) (1 20 120 240 960)	-0.2383	0.010	9 475	.6 0.0000	-0.1168	0.0081	206.9	0.0000	-0.0197	0.0110	3.2	0.0730	-0.1402	0.014	3 96	.3 0.0000	-0.0538	0.0125	9 17.5	0.0000	-0.0307	0.0132	5.4 0.020	3 -0.03	75 0.0	101	13.7 0.0002	-0.1130	0.0147	59.0	0.0000
Frequency (1, 2.5, 5, 10.5, 15)	-0.0599	0.004	7 163.	.3 0.0000	-0.0189	0.0040	22.6	0.0000	0.0475	0.0067	50.9	0.0000	0.0000		0 0		0.0000		0.0	0.0000	0.0483	0.0067	52.1 0.000	0 0.04	74 0.00	066	51.7 0.0000	0.0000			
Bill Compensation (1%, 5%, 10%, 12%, 15%)	-0.0072	0.004	9 2	2 0.1413	0.0452	0.0038	139.1	0.0000	0.0200	0.0043	21.6	0.0000	-0.0126	0.005	0 6	.3 0.0118	0.0377	0.0036	5 111.9	0.0000	0.0196	0.0043	20.5 0.000	0 0.02	01 0.00	J43	22.0 0.0000	0.0575	0.0042	190.3	0.0000
La (duration) + requeries (events per o years)					0.0000				0.0210	0.00017	0.0	0.0000	-0.0156		5 0	9 0 3441	0.0061		0.14		-0.0132		0.6 0.42/	9 0.00				0.0163		0.8	
En(duration) Treq2_3 (2-3 times in 3 years)					0.0000				0.0000				-0 1444	0.016	7 74	7 0.0000	-0.1078	0.0164	43.2	0.0000	-0.1521	0.0175	75.5 0.000	0 -0.14	52 0.0	152	90.9 0.0000	-0.1086	0.0180	36.6	0.0000
Ln(duration) Treq4_6 (4-6 times in 3 years)			0 0	0 0.0000	0.0000			0.0000	0.0000				-0.1485	0.016	7 78	8 0.0000	-0.1244	0.0165	5 56.7	0.0000	-0.2145	0.0208	107.0 0.000	0 -0.20	59 0.0	/183	127.2 0.0000	-0.1398	0.0194	52.2	0.0000
En(duration) Treq7-14 (7 to 14 times in 3 years)				0 0.0000	0.0000				0.0000				-0.1927	0.017	2 125	8 0.0000	-0.1640	0.0170	93.0	0.0000	-0.3052	0.0260	137.4 0.000	0 -0.29	57 0.0	237	156.5 0.0000	-0 1934	0.0191	102.8	0.0000
Enduration) Treq15+ (15 or more times in 3 years)					0.0000				0.0000				0.0000	0.000	0 0	0 0.0000	0.0000	0.0000	0.0	0.0000	0.0000	0.0000	0.0 0.000	0 0.00	0.0	000	0.0 0.0000	0.0000	0.0000	0.0	0.0000
Freq2_5 (2-5 times in 5 years)				0 0.0000	0.0000				0.0000				0.0000		0 0		0.0000		0.0		0.0000			0 0.00				0.0000			
Freq4_0 (4-0 times in 3 years)			0 0.	0.0000	0.0000			0.0000	0.0000				0.0000		0 0	0.0000	0.0000		0.0	0.0000	0.0000			0 0.00	0.0		0.0 0.0000	0.0000			
Freq1-14 (7 to 14 times in 3 years)			0 0.	0.0000	0.0000			0.0000	0.0000				0.0000		0 0	0.0000	0.0000		0.0	0.0000	0.0000		0.0 0.000	0 0.00	0.0		0.0 0.0000	0.0000			
Constant	1.3471	0.077	9 299.	.3 0.0000	0.0000				0.0000				0.9807	0.067	9 208	.9 0.0000	0.0000		0.0	0.0000	0.0000			0 0.00				0.0000			
Don't know	-4.6114	0.117	1 1551	1 0.0000	-3 2643	0.0874	1393.4	0.0000	-3.2643	0.0874	1393.4	0.0000	-4 2450	0 110	7 1470	8 0.0000	-3.2643	0.0874	4 1393.4	0.0000	-3 2643	0.0874	1393.4 0.000	0 -3.26	13 0.0	874 .	393.4 0.0000	-3 2643	0.0874	1393.4	0.0000
					0.00												0.20.0				0.0010							0.000			
Nagelkerke R Square	36.3				42.8				44.2				36.7				44.0				44.4			4	.4			50.2			
Overall % correct	74.0				72.0				72.6				73.0				73.0				72.5			7.	.4			75.9			
% Chosen correct	49.7				37.5				47.3				56.6				49.4				51.4			5	.3			52.3			
				•				•				•				•	_													•	
	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower	Upper	WTA	VoLL	Lower Uppe	WT	VoLL	Lo	wer Upper	WTA	VoLL	Lower	Upper
1.0 hrs duration, once every 3 years	-£2,673				£204	£60,740	£48,354	£73,127	£96	£28,515	£2,811	£54,218	-£836				£107	£31,815	5 £15,776	£47,855	£56	£16,546	-£16,554 £49,64	6 f	81 £23,9	974 -£	4,011 £51,959	£147	£43,787	£30,997	£56,576
1.0 hrs duration, 2-3 times in 3 years	-£2,983				£220	£65,403	£53,017	£77,790	£129	£38,386	£12,682	£64,090	-£836				£107	£31,815	5 -£2,506	£66,137	-£37	-£10,941	-£80,709 £58,82	7	E8 -£2,	347 -£3	0,332 £25,637	£147	£43,787	£17,993	£69,581
1.0 hrs duration, 4-6 times in 3 years	-£3,500				£246	£73,175	£60,789	£85,562	£184	£54,838	£29,134	£80,541	-£1,696				£321	£95,625	5 £57,325 £	£133,925	£390	£116,219	£3,154 £229,28	4 £3	36 £114,	177 £1	3,879 £215,675	£288	£85,857	£58,209	£113,506
1.0 hrs duration, 7-14 (7 to 14 times in 3 years	-£4,534				£298	£88,719	£76,333	£101,106	£295	£87,741	£62,037	£113,445	-£1,721				£354	£105,417	7 £66,141 £	144,693	£321	£95,689	-£46,840 £238,21	7 E3	20 £95,:	396 -£3	3,489 £224,282	£329	£97,970	£68,589	£127,351
1.0 hrs duration, 15 or more times in 3 years	-£5,568				£350	£104,263	£91,877	£116,649	£405	£120,645	£94,941	£146,348	-£1,985				£433	£128,832	2 £86,767 £	£170,897	£360	£107,087	-£79,997 £294,17	1 E3	50 £107,	171 -£6	4,045 £278,387	£399	£118,720	£88,014	£149,425
6.0 hrs duration, once every 3 years	-±4,148				£320	£95,210	£75,415	£115,005	£189	£56,145	£15,067	£97,222	-±1,335				£1/1	£50,844	4 £25,212	£76,477	£126	£37,402	-£15,495 £90,25	9 ±1	54 £48,1	508 £	4,085 £93,530	£235	£69,976	£49,537	£90,415
6.0 hrs duration, 2-3 times in 3 years	-±4,458				£336	£99,873	£80,078	£119,668	£295	£87,782	£46,705	£128,860	-±1,335				£1/1	£50,844	4 -£4,006 f	105,694	£33	£9,915	-£101,581 £121,41	2 1	/b ±22,4	48/ -£2	2,236 £67,209	£235	£69,976	£28,754	£111,197
6.0 hrs duration, 4-6 times in 3 years	-£4,975				£362	£107,645	£87,850	£127,440	£472	£140,512	£99,435	£181,589	-£2,711				£513	£152,818	B £91,611 £	214,026	£808	£240,530	£59,840 £421,22	0 £7	93 £235,9	301 £7	4,656 £397,147	£461	£137,209	£93,024	£181,395
6.0 hrs duration, 7-14 (7 to 14 times in 3 years	-£6,009				£414	£123,189	£103,394	£142,984	£826	£245,971	£204,894	£287,048	-£2,750				£566	£168,467	7 £105,700 £	231,234	£882	£262,520	£34,745 £490,29	6 £8	55 £257,4	404 £5	1,432 £463,377	£526	£156,566	£109,613	£203,520
6.0 hrs duration, 15 or more times in 3 years	-±7,043				£466	£138,733	£118,938	£158,527	£1,181	£351,430	£310,353	£392,507	-£3,172				£692	£205,887	/ £138,662 £	273,111	£1,127	£335,536	£36,557 £634,51	5 ±1,1	J4 ±328,0	597 £5.	5,076 £602,318	£637	£189,726	£140,656	£238,797
12.0 hrs duration, once every 3 years	-±4,718				£365	£108,545	185,884	£131,205	£225	£66,833	£19,809	£113,858	-£1,529				£196	£58,20t	5 £28,862	£87,549	£153	£45,470	-£15,085 £106,02	5 ±1	96 £58,4	415 E	7,217 £109,612	£269	£80,107	£56,709	£103,505
12.0 nrs duration, 2-3 times in 3 years	-£5,028				£380	£113,208	190,547	135,868	£359	£106,892	£59,867	£153,916	-£1,529				£196	£58,20t	5 -£4,586 f	120,997	£60	£17,983	-£109,656 £145,62	3 ±1	J8 ±32,0	J94 -£1	9,104 £83,291	£269	£80,107	£32,917	£127,296
12.0 nrs duration, 4-6 times in 3 years	-£5,545				£406	±120,980	£98,319	£143,640	£583	±173,655	£126,631	£220,680	-E3,104				£588	±174,944	4 £104,875 £	245,013	£970	±288,620	£81,769 £495,47	1 £9	50 £282,	758 £9	8,167 £467,350	£528	£157,075	£106,492	£207,658
12.0 nrs duration, 7-14 (7 to 14 times in 3 years	-£6,579				£459	£136,523	£113,863	£159,184	£1,032	£307,183	£260,158	£354,207	-£3,149				£648	£192,858	5 £121,003 £	264,712	£1,099	£327,060	£66,306 £587,81	3 £1,0	/5 £320,0	J/8 £8	4,284 £555,872	£602	£179,235	£125,483	£232,986
12.0 nrs duration, 15 or more times in 3 years	-£7,613				£511	±152,067	£129,407	£174,728	±1,481	±440,710	£393,686	£487,735	-£3,631				£792	±235,696	5 £158,738 £	312,653	±1,424	±423,913	£81,646 £766,17	9 £1,3	92 £414,3	595 £10	1,158 £727,632	£730	±217,195	£161,020	£273,371
48.0 nrs duration, once every 3 years	-£5,859				£454	±135,214	£106,821	£163,607	£296	£88,211	£29,292	£147,130	-£1,915				£245	£72,928	B £36,163 £	109,694	£207	±61,607	-£14,265 £137,47	9 £2	51 £77,0	529 £1	3,481 £141,777	£337	£100,369	£71,053	£129,686
48.0 nrs duration, 2-3 times in 3 years	-£6,169				£470	£139,877	£111,484	£168,270	£488	£145,110	£86,191	£204,029	-£1,915				£245	£72,928	6 -£5,745 £	151,602	£115	£34,120	-£125,805 £194,04	5 E1	/2 £51,	5UB -£1	2,840 £115,456	£337	£100,369	£41,244	£159,495
48.0 hrs duration, 4-6 times in 3 years	-£6,686				£496	£147,649	£119,256	£176,042	£806	£239,942	£181,023	£298,861	-£3,889				£736	£219,195	5 £131,402 £	306,987	£1,293	£384,800	£125,628 £643,97	3 £1,2	55 £376,4	473 £14	5,191 £607,755	£661	£196,806	£133,428	£260,183
48.0 nrs duration, 7-14 (7 to 14 times in 3 years	-£7,720				£548	±163,193	£134,800	£191,585	±1,443	±429,606	£370,687	£488,525	-£3,945				£812	±241,640	U £151,610 £	331,670	±1,532	±456,138	£129,429 £782,84	7 £1,4	эь £445,4	+24 £14	9,988 ±740,861	£754	£224,571	£157,223	£291,919
48.0 nrs duration, 15 or more times in 3 years	-£8,754				£600	£178,737	£150,344	£207,129	£2,081	£619,270	£560,351	£678,189	-£4,549				£992	£295,313	5 £198,890 £	391,737	£2,018	£600,665	£171,824 mmmmmm	r £1,9	585,1	/91 £19	3,323 £978,260	£914	£272,134	£201,749	£342,518

ANNEX 1.4: SECONDARY 'MITIGATION' DISCRETE CHOICE EXERCISE

Attributes

The initiatives that DNOs could undertake to mitigate the dis-benefits of outages and tested in the research are summarised in the table below.

Figure 1.4.1.	: Attributes and	levels tested	d in the seco	ondarv choic	e experiment
i igaile i i ii i		10101010100000		, , , , , , , , , , , , , , , , , , ,	0 0/10 0/10/10/10

Service attribute	Level 1	Level 2	Level 3	Level 4	Level 5	Level 6	Level 7
Assistance for customers vulnerable during the power cut/s	Home visits <i>(to</i> offer help and advice)	A welfare pack to help cope with the power cut (<i>might include: a</i> blanket, hand warmer, baby bottle warmer, hot flask, analogue telephone or a wind up torch)	Generator (to provide a partial supply for essential medical equipment, appliances and lights)	Sending a mobile catering van (to provide hot food and drinks)	Sending a mobile charging unit (to charge mobile phones and tablet devices)	None	
Proactive information about the power cut/s	Updates sent to a nominated friend or family member <i>(instead of or in addition to you)</i>	Phone call(s) made to your mobile or landline (with updates and details of changes)	SMS (short message service) Updates and details of changes sent to your mobile phone	Automated text- to-speech message (computer- generated spoken voice update sent to your landline phone)	Social media (Twitter, Facebook etc.) (with updates and details of changes)	Public address/tannoy system (with updates and details of changes)	No proactive updates
Quality of information provided	A justified reason for the power cut	Accurate information confirming when power will be restored	An indication of the number of properties affected by the power cut	Information about the area affected by the power cut	Advice about what to do during a power cut (eg with alarms, freezers, specific equipment)	Confirmation that your electricity is back on (for people that go out or businesses that close during a power cut)	No information provided

Experimental designs

So that these scenarios could be inter-leaved with the main discrete choice exercise, designs with the same numbers of scenarios as the main design were developed. That is, domestic respondents had a design of 27 blocks of six scenarios in each, one design for WTP and one for WTA. SME respondents had a design of nine blocks of six scenarios.

The discrete choice exercise

The tables below give examples of how the secondary scenarios were presented, with <u>each</u> <u>one appearing immediately after a single WTP or WTA scenario respectively</u>. On the same screen, respondents were reminded of the choice they had made from the preceding scenario, for example the choice shown in Figure 1.3 of the main body of this report, where the selection was for: *advanced warning of 14 days' notice, seven or more power cuts, one hour per power cut and a cost of £10.*

Figure 1.4.2: Example 'secondary' scenario for domestic customer (planned outage – WTP) (shown with details of the option selected in the preceding scenario from the main CE).

Below are possible types of *support* that you could receive during the above power cut, please choose the support option you prefer:

WTP	Support A	Support B	
Quality of information provided	Advice about what to do during a power cut (eg with alarms, freezers, specific equipment)	Information about the area affected by the power cut	Not sure
Proactive information about the power cut/s	Updates sent to a nominated friend or family member (instead of or in addition to you)	SMS (short message service) Updates and details of changes sent to your mobile phone	
Assistance for customers vulnerable during the power cut/s	None	None	
Additional payment you make for support	No extra cost to you	Extra cost to you: £2	
Please make your selection here:	0	۲	0

Figure 1.4.3: Example 'secondary' scenario for SME customer (unplanned outage – WTA) (shown with details of the option selected in the preceding scenario from the main discrete choice exercise).

Below are possible types of *support* that you could receive during the above power cut, please choose the support option you prefer:

WTA	Support A	Support B		
Quality of information provided	No information provided	A justified reason for the power cut		
Proactive information about the power cut/s	No proactive updates Public address/tannoy system (with updates and details of changes)		Not sure	
Assistance for customers vulnerable during the power cut/s	Sending a mobile charging unit (allowing you to charge mobile phones and tablet devices)	None		
The extra payment you would get with this support	Extra payment to you: 3% of your annual electricity bill	No extra payment to you		
Please make your selection here:	۲	0	0	