

A Stated Preference Study of Electricity Generation in Western Canada

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Abstract

This study examined the preferences for various forms of electricity generation among residents of western Canada (British Columbia, Alberta, and Saskatchewan). A stated preference survey was administered through an on-line system and 340 respondents provided feedback on their preferences based on the monthly cost to them, GHG emissions associated with the plant, and its distance from their residence. The results suggest heterogeneity of preference between the provinces. The results of this research will be used as the basis for a choice model of electricity generation under an assumption of distributed networks.

Keywords: Heterogeneous Preferences, Electricity Choice Sensitivity, Green Electricity

1. Introduction

Electricity generation accounts for 14% of anthropomorphic GHG emissions in western Canada (British Columbia, Alberta, and Saskatchewan) [1]. As such, it is an important industry if we are to mitigate climate change impacts. We all enjoy the benefits of access to electric energy and the services it makes possible. Conservation initiatives have raised awareness among the public of the need to reduce their consumption of electricity, but it is unlikely this will provide the requisite reductions in generation-related emissions. Changes in generation technology will be required, especially in jurisdictions such as Alberta and Saskatchewan where generation has historically

11 come from coal-fired power plants. This form of generation produces mean
12 life-cycle emissions of 888 tonnes of CO₂ equivalents per GWhr of genera-
13 tion, which contrasts with 500 tonnes for natural gas and roughly 25 tonnes
14 for most other conventional sources (e.g. nuclear, hydro, and wind). Recent
15 changes to provincial and national policy in Canada have suggested a shift
16 towards action on the contributions of electricity generation towards climate
17 change. The Alberta government has begun a program to phase out the use of
18 coal-fired plants in the province and replace them with a combination of one-
19 third natural gas-fired and two-thirds renewable generation [2]. Renewable
20 alternatives are becoming increasingly cost effective as more effort is focused
21 on their development and improvement. For the purposes of this research,
22 renewable energy will be defined as any source for which the input fuel can
23 be replaced in the lifetime a human or any source which can be derived from
24 an input energy source with a consumption time scale - at current rates - on
25 the order of the lifespan of the earth. This would include hydro dams, wind
26 turbines, solar panels, geothermal energy, and tidal sources. Many renewable
27 generation methods are location-specific; tidal sources are not feasible for re-
28 gions far from tidal bodies of water. The local availability of an input resource
29 will often influence preference because its use will positively effect the local
30 economy and have spill-over effects from construction and maintenance work.

31

32 This study builds a Random Utility Theory (RUT) model of electricity
33 preferences in western Canada, with the aim of developing a choice model
34 of the preferred electricity system under an assumption of distributed and
35 "smart" electricity infrastructure in western Canada. The current central-
36 ized system of electricity provision is structured around large-scale generation
37 sources located at remote sites, which are transmitted to consumptive cen-
38 tres of population and industry. Consumers have minimal knowledge of spot
39 prices, the current mix of online electricity sources, or their consumption
40 patterns. This fails basic tenets of market economics as agents of demand
41 are severely hampered in their ability to respond to supply price variation.
42 The system has fallen behind generation technology availability and the abil-
43 ity of information technology (IT) to inform consumers of their consumption
44 patterns. It is proposed that a distributed network, making use of current
45 IT, would act similar to a transportation network. In transportation mod-
46 elling, agents of demand (persons) are presented with a set of potential travel
47 modes. Their mode choice is a function of the characteristics of each mode
48 and the individual choice agent (e.g. income, sensitivity to environmental

49 degradation, and willingness to engage in communal action by taking public
50 transit). Similar characteristics would arise in electricity preference if we
51 were to provide mechanisms of choice to individuals. In this type of model,
52 the factors contributing to the choice of an alternative are normally ascer-
53 tain via stated preference (SP) methods. This method was employed in the
54 present research for its ability to measure preferences for alternatives not
55 currently available in a region.// There is a wealth of research on preference
56 for renewable generation alternatives. Preferences are typically determined
57 through one of two methods, or a combination thereof. The first method,
58 revealed preference (RP), is based on research in jurisdictions with renewable
59 premium programs through which customers may choose to pay an additional
60 monthly fee to support the construction of renewable sources of electricity.
61 This option is available to retail customers in the study area through Bull-
62 frog Power and in several local regions (e.g. Calgary and Edmonton) through
63 local utility providers. This method has been used in previous studies [3] as
64 a means of quantifying willingness to pay (WTP) for renewable alternatives.
65 However, this is prefaced on an assumption of uniform and substantial, if
66 not infinite, spending budgets. The second approach employed is an SP sur-
67 vey. In addition to the flexibility of this method discussed above, SP has
68 the ability to draw-out the preferences of respondents irrespective of their
69 budget constraints. This data could be utilized to determine the desire for
70 government subsidy of renewable energy programs. To accomplish this task
71 using RP data would require an income profile of current customers, which
72 is unlikely to be made available.

73

74 **2. Background**

75 *2.1. Regional Context*

76 The study region consists of the three western-most province of Canada:
77 British Columbia, Alberta, and Saskatchewan. This region was chosen be-
78 cause data was made available to the researcher from ENMAX Energy Inc. in
79 Calgary, Alberta for 2014 across their service area and aggregated by postal
80 code. Energy policy in each province is administered by provincial regulation
81 and the generation mix varies substantially between provinces due to differ-
82 ences in regulation methods and available resources. British Columbia is a
83 coastal province and has access to abundant water resources. This means
84 that 86% of its electricity is sourced from hydro-electric dams, 7.4% from

85 natural gas-fired plants, and the remainder from a variety of wind, solar, and
86 tidal sources (ref). Alberta and Saskatchewan are land-locked provinces with
87 significant fossil resources and no access to tidal waters. Alberta has seen
88 a recent shift away from coal-fired plants with the construction of several
89 new natural-gas fired plants. The current generation mix is 43.6% natu-
90 ral gas and 38.5% coal. Alberta has significantly increased its utilization
91 of wind resources, especially in southern regions around Fort Macleod, and
92 presently sources 9.0% of its generation from wind turbines. The remainder
93 of the provincial generation comes from a combination of hydro and biomass
94 plants. Similar to Alberta, Saskatchewan has high rates of coal (44.0%) and
95 natural gas (29.4%) generation due to its access to these cheap feed-stocks.
96 The province also has a large river system and utilizes it for 22.0% of its
97 electricity needs. The remainder of generation in Saskatchewan comes from
98 wind farms in its southern region.

99 *2.2. Review of Literature*

100 There is a large literature on the subject of preference for renewable elec-
101 tricity technologies and studies generally examine either the willingness to
102 pay (WTP) for renewable alternatives or heterogeneity in the preference for
103 renewable alternatives. Yoo and Reed [4] examine heterogeneity based on
104 marginal cost over the respondent's existing utility bill and the number of
105 jobs created to implement the technology. They find respondents show the
106 strongest heterogeneity in their preference for solar, with this alternative be-
107 ing preferred by those who identify as environmentally conscious. Those who
108 do not identify as environmentally conscious, are found to prefer wind power.
109 All respondents are indifferent to biomass generation. Mozumber et al. [5]
110 find a WTP of \$10/month in New Mexico, or roughly 14% of an average
111 monthly bill for a shift to 10% renewables and a willingness to bear a 36%
112 increase in cost for a 20% share in renewables. They recognize these results
113 as biased by the sample, which has an average age of 24, 38% of whom re-
114 ported contributing to an environmental group. They use a factor developed
115 by Champ and Bishop [3] to adjust for bias based on a study in Wisconsin
116 in which they found a stated WTP of \$100 per year, but actual payments
117 which averaged only \$59 per year. This study is focused on a proposed wind
118 farm in eastern New Mexico, in the context of a state mandate to attain 10%
119 renewable sourcing by the year 2010. They provide details on the benefits of
120 the project and its potential to power 94,000 homes. There is no compari-
121 son with other forms of renewable generation or current forms of generation.

122 A study by Bergmann et al. [6] examines differences in the preferences of
123 urban and rural residents in Scotland. A reference natural gas-fired plant
124 is compared to one of a series of alternatives, which includes large offshore
125 and onshore wind farms, a moderate size wind farm, and a biomass plant.
126 The output of each plant and a measure of the size of the development is
127 provided to survey respondents. They find urban residents value generation
128 alternatives with low landscape impacts, which do not harm wildlife. Rural
129 residents were found to be more strongly influenced by the number of jobs
130 created and land requirement, as most of these jobs and generation sites
131 would be located in rural areas. Several other studies were identified, which
132 examine the WTP for renewable alternatives [7][8][9][10][11][12]. They
133 find wind and solar are preferred over biomass, but there is no consensus as
134 to the preference between wind and solar. It appears to be a decision based
135 in local experience, relative costs and production rates, and the availability
136 of each resource in the survey area.

137

138 **3. Methodology**

139 *3.1. Survey Methods*

140 This survey was implemented as a stated-preference (SP) choice experi-
141 ment. SP experiments are a common method of eliciting preference in eco-
142 nomics and planning fields [13]. This approach has the advantage of allowing
143 for solicitation of preferences for alternatives not currently available to the
144 survey respondent. This is an important feature for policy analysis of the
145 desire for new forms of technology and the willingness-to-pay (WTP) of the
146 citizenry. The choice experiment is typically framed as a comparison of two
147 competing alternatives, with several attributes listed of interest to the re-
148 searcher. It is assumed the chosen alternative is "liked" by the respondent
149 and the unchosen alternative is "disliked". The attributes of the alternatives
150 are randomly assigned across experiments to provide the necessary variation
151 to estimate parameter values. Societal preferences can then be inferred from
152 a large set of such choice experiments, administered to a sample of the target
153 population. The results of the experiment can then be translated into util-
154 ity functions for each alternative according to standard methods of Random
155 Utility Theory (RUT).

156 RUT represents the utility of a particular good or service as a set of determin-
157 istic factors and a stochastic error component representing the unobserved

158 component of utility. The set of deterministic factors are specified by the
 159 analyst so as to minimize the utility ascribed to stochastic error. The de-
 160 terministic component of utility is decomposed into a set of attributes, with
 161 qualitative or quantitative levels, representing the available alternative for
 162 the good or service. The probability of an alternative can be specified as:

$$P_{ni} = \frac{e^{\beta' x_{ni}}}{\sum_j e^{\beta' x_{nj}}} \quad (1)$$

163 where P_{ni} represents the probability of individual n selecting alternative
 164 i , β' is an estimate of the unit measurable utility of the attribute x_{ni} for
 165 individual n , and $\beta' x_{nj}$ is the summation of the measurable utilities ascribed
 166 to all j alternatives by individual n . The exponential form of the function
 167 is the result of assuming a Weibull distribution for the error component and
 168 represents a general logit formulation.

169 3.2. Survey Design

170 The purpose of the present choice experiment was to ascertain the elec-
 171 tricity generation preferences of residents of western Canada. It was ad-
 172 ministered as an online survey via an SP survey system developed for the
 173 purposes of this study. The survey was disseminated via a variety of meth-
 174 ods of communication. The majority of responses were obtained through a
 175 "snowball" method of emails being sent to contacts in the study region, who
 176 were requested to forward the survey to their contacts who lived within the
 177 study region. Social media (Facebook, Twitter, reddit, and online forums)
 178 were utilized to distribute the survey to a wider group of respondents. Each
 179 respondent was first presented with an ethics disclosure and summary of the
 180 experiment purposes and outcomes, before being asked whether they would
 181 like to proceed with participation in the study. They were then taken through
 182 a series of choice experiments consisting of two hypothetical electricity gen-
 183 eration plants (see Figure 1).

184 Each choice was randomly selected from a list of 9 alternatives and 3 at-
 185 tributes, described in Table 1, which represented 720 potential alternatives.

186 Alternatives were chosen based on existing sources of generation in the
 187 three jurisdictions and the most viable alternatives not currently present.
 188 Monthly costs provided a monetary quantification of WTP and were based
 189 on average monthly electricity charges available from the Alberta Ministry
 190 of Energy. The energy cost was presented to respondents, rather than the

Generation Source	Large Solar Cell Array	Coal-Fired Plant
Cost (\$/month)	36	36
Direct Emissions	None	High
Distance from your residence (km)	7	63
	●	●

Figure 1: Figure caption

Table 1: Choice Alternative and Attribute Levels

Attribute	Level	Units
Alternative	Biomass Plant	NA
Alternative	Coal-Fired Plant	NA
Alternative	Natural Gas-Fired Plant	NA
Alternative	Hydro Dam	NA
Alternative	Large Wind Farm	NA
Alternative	Small Wind Turbine	NA
Alternative	Large Solar Cell Array	NA
Alternative	Small Solar Panel	NA
Cost	36	\$/month
Cost	58	\$/month
Cost	87	\$/month
Direct CO ₂ Emissions	None	\$/month
Direct CO ₂ Emissions	Low	NA
Direct CO ₂ Emissions	Med-Low	NA
Direct CO ₂ Emissions	Med-High	NA
Direct CO ₂ Emissions	High	NA
Distance from Residence	0	km
Distance from Residence	7	km
Distance from Residence	18	km
Distance from Residence	63	km

191 total cost they would see on their monthly utility bill. This was done to
192 compare the marginal costs of each generation source, absent of the inflation
193 produced by non-energy costs (i.e. distribution, transmission, and adminis-
194 tration), which were considered constant regardless of the generation source.
195 For sources not presently available on the grid, the additional infrastructure
196 costs would be incorporated into the marginal cost of energy and this effect
197 could be assessed based on survey responses. The Ministry of Energy esti-
198 mates the energy cost of electricity at \$20-50 per month [14][?]. The costs
199 presented to survey respondents were based on these estimates. Emissions
200 were presented in a qualitative form because there is less familiarity among
201 the public as to the quantitative value of emissions associated with each gen-
202 eration source. This provided a measure of the sensitivity of respondents to
203 allowing emissions as a trade-off for cost or distance. It should be noted that
204 all emission combinations were considered, including those that may appear
205 unrealistic: a small wind turbine with high direct CO₂ emissions. Inclusion
206 of the full set of alternatives prevents selection biases by the survey developer
207 and provides a means of quantifying unrepresented preferences for a particu-
208 lar generation source. For example, a respondent might be presented with a
209 small wind turbine with high emissions and a natural gas-fired plant with high
210 emissions. *Ceteris Parabis*, the respondent may choose the natural gas-fired
211 plant and express an inherent preference for this source. This type of prefer-
212 ence can then be represented via the inclusion of alternative specific constants
213 in the utility estimation. The final attribute considered in this experiment
214 was the distance of the generation source from the respondent’s residence.
215 This metric has seen minimal consideration in electricity choice literature. It
216 was included in the present study for three key reasons. Firstly, there has
217 been increased interest in western Canada to explore renewable electricity
218 generation. These sources can be readily scaled to the individual household
219 level, meaning there is a higher probability of such sources being located near
220 your residence. Secondly, advances in technology have made distributed elec-
221 tricity a viable alternative to our current grid system. Distributed electricity
222 systems are characterized by small-scale generation sources operating at the
223 community scale. As such, it is becoming increasingly important to measure
224 the sensitivity of residents to having various sources of electricity generation
225 constructed in their community. The details of the choice model resulting
226 from this survey will be discussed at greater length in a future publication,
227 but it is pertinent to the present study that distance from residence to the
228 generation source is included in the survey question. A fundamental research

229 question to be addressed via this research is the spatial structure of electric-
230 ity generation as small-scale renewables become viable options.
231 A total of 340 people were surveyed across the provinces of British Columbia,
232 Alberta, and Saskatchewan. This produced a total of 2040 usable stated
233 preference pairs. Demographic characteristics of survey respondents were
234 compared with statistical data on the regional demographics [?][?][?].
235 Respondents under the age of 40 were over-represented in the sample at 72%
236 as compared to 40% across the model region. Reported incomes were dispro-
237 portionately above \$100,000 with 36% of respondents reporting household
238 incomes above this threshold as compared to 11% of the population. The
239 urban-rural composition of respondents was within an acceptable range of
240 5% of the population. The age of the sample was most likely biased by the
241 avenues of dissemination and age profile of the researcher’s contacts. Weights
242 were applied to the model to compensate for deviation of the sample from
243 the population distribution of age, income, urban-rural divide, and province
244 of residence.

245 **4. Results**

246 A series of logit functions were built to examine the relative significance
247 of each variable and the heterogeneity of preferences within the population.
248 In each of the functions, utility was measured relative to the alternative con-
249 stant for a coal-fired plant. Cost and distance were factored down by an
250 order of magnitude so that parameters were applied per \$10 and 10 km, re-
251 spectively. The first model considered cost, emissions, and distance to be
252 homogeneous in their importance across the survey population and alterna-
253 tive set. This formulation of utility suggested respondents were indifferent to
254 a transition to natural-gas fired plants, relative to coal-fired plants, and all
255 other forms of generation were preferred to coal (at a 90% CI). Nuclear plants
256 were considered the most similar to coal-fired plants. An initial examination
257 of the alternative constants for wind and solar alternatives suggested a differ-
258 ence in the parameters between large and small alternatives for both sources;
259 however, a complete statistical analysis that accounts for correlations gave a
260 t-statistic of 0.3 for both comparison by source size (significantly below the
261 1.65 threshold at a 90% CI). Distance sensitivity was not significant when
262 considering all plants homogeneous, which indicated distance sensitivity may
263 be source specific. From these results, it was estimated that an improvement
264 in GHG emissions is valued at \$28.80 per month by respondents for each

265 level of improvement.

266

Table 2: Standard Logit - with Demographic Weights

Parameter	Value	SE
Cost (\$ x10)	-0.02368	0.00779
Emissions (Level)	-0.06819	0.0168
Distance (km x10)	-0.005140	0.0111
Biomass Constant	0.6799	0.0919
Coal Constant (Fixed)	0.0000	0.000
Natural Gas Constant	0.07901	0.107
Hydro Constant	0.7456	0.104
Large Wind Constant	0.6936	0.0989
Small Wind Constant	0.4308	0.0968
Large Solar Constant	0.3770	0.0947
Small Solar Constant	0.6324	0.104
Nuclear Constant	0.1767	0.0946

267 The base model was adjusted to implement error terms for cost and GHG
268 emissions. It was posited that sensitivity to these parameters would be het-
269 erogeneous because cost sensitivity varies by income and valuation of ad-
270 dressing environmental impacts is variable within the population. The error
271 component, or mixed logit, representation of logit has been found to increase
272 the ability of models to simulate preference. Error component logit allows the
273 analyst to specify distributions for attribute parameters. This can be inter-
274 preted as allowing the utility each respondent ascribes to a particle attribute
275 as varying across respondents. The general form of the error component
276 model is represented as follows:

$$P_{ni} = \int \frac{e^{\beta' x_{ni}}}{\sum_j e^{\beta' x_{nj}}} f(\beta) d\beta \quad (2)$$

277 where variables are defined as before and the logit function is integrated over
278 a probability density function. Lognormal distributions were assumed for
279 both cost and GHG emissions as it was assumed, despite heterogeneity in
280 weighting, both increased cost and GHG emissions are uniformly viewed as
281 negative. This formulation produced a 16% improvement in the model fit
282 according to the ρ^2 . The heterogeneity in both parameters was found to be

283 statistically significant. A nested logit implementation was also explored for
 284 nesting structures of 1. renewable (biomass, hydro, large wind, small wind,
 285 large solar, small wind) and non-renewable (coal, natural gas, and nuclear)
 286 and 2. small-scale (small wind and small solar) and large-scale (biomass,
 287 coal, natural gas, large wind, large solar, and nuclear). It was determined
 288 there was insufficient similarity between alternatives to justify either of these
 289 nesting structures.

290

Table 3: EC Logit (Lognormal Parameters for Cost and Emissions) - with Demographic Weights

Parameter	Value	SE
Cost (\$ x10)	-0.00721	0.00283
Error Component(Cost) (\$ x10)	-0.01466	0.00670
Emissions (Level)	-0.03546	0.0530
Error Component(Emissions) (Level)	-0.07271	0.0392
Distance (km x10)	-0.0005320	0.0124
Biomass Constant	1.217	0.212
Coal Constant (Fixed)	0.0000	0.000
Natural Gas Constant	0.1028	0.118
Hydro Constant	0.8300	0.128
Large Wind Constant	0.4353	0.121
Small Wind Constant	0.4731	0.107
Large Solar Constant	0.3770	0.110
Small Solar Constant	0.7055	0.122
Nuclear Constant	0.1865	0.106

291 Taking into account the heterogeneity observed in the cost parameter,
 292 each of cost, emissions, and distance were broken out by income. Three in-
 293 come brackets were defined: <\$50,000; %50,000-\$99,999; and <=\$100,000.
 294 Placing respondents into income categories improved the model fit by 29%,
 295 relative to the base case. Results suggested that cost is an important factor
 296 to low-income respondents, becomes more important in the middle income
 297 bracket, and less significant in the highest income bracket. This peaking in
 298 its significance could be a result of lower income respondents being younger
 299 and single, whereas the middle income respondents have families that place
 300 financial restrictions on them. Higher income earners placed less significance
 301 on the cost of electricity, as well as emissions and distance. This did not fit

302 with the standard assumption of high income earners being averse to envi-
303 ronmental ills in their neighbourhood and pushing such impacts into other
304 areas. A potential cause for this observation may be the reference of param-
305 eters to the coal constant. The model provides a mean value of the parameter,
306 whereas a higher parameter value for this constant among high income house-
307 holds would place the relative values of cost, distance, and GHG emissions
308 below that of the coal constant. This was tested by running two restricted
309 versions of the base model: once for respondents with household incomes
310 below \$100,000 and a second model for those with incomes of \$100,000 or
311 more. This analysis found high income households as having parameter esti-
312 mates for cost and distance not significantly different from the coal constant
313 (at 90% CI). This may be a consequence of the sample demographics. Many
314 of the younger respondents were also found to report as being in the high
315 income group. This suggested the presence of a group of young professionals
316 in the sample who may still maintain a frugal student perspective in their
317 responses. Such respondents may focus on the cost component of each alter-
318 native and place less weight on distance and GHG emissions relative to the
319 prevailing assumption regarding high income households.

Table 4: Standard Logit (by Income Bracket) - with Demographic Weights

Parameter	Value	SE
Cost-LowIncome (\$ x10)	-0.01821	0.0101
Emissions-LowIncome (Level)	-0.1184	0.0213
Distance-LowIncome (km x10)	-0.01448	0.0136
Cost-MidIncome (\$ x10)	-0.04055	0.0161
Emissions-MidIncome (Level)	-0.06063	0.0382
Distance-MidIncome (km x10)	-0.05439	0.0273
Cost-HighIncome (\$ x10)	-0.007594	0.0205
Emissions-HighIncome (Level)	0.1263	0.0453
Distance-HighIncome (km x10)	0.1190	0.0343
Biomass Constant	0.7227	0.0931
Coal Constant (Fixed)	0.0000	0.000
Natural Gas Constant	0.08046	0.109
Hydro Constant	0.7763	0.106
Large Wind Constant	0.7101	0.100
Small Wind Constant	0.4183	0.0984
Large Solar Constant	0.4220	0.0957
Small Solar Constant	0.6880	0.105
Nuclear Constant	0.1551	0.0962

320 The results of breaking the model out by income were checked against
321 one broken out by age into three categories: 18-30 years of age; 30-50 years
322 of age; and 50 years of age and over. The results of this analysis fit more
323 closely with expectation. Only the youngest age category had a negative
324 cost sensitivity significantly different from 0 (at %90 CI). Emissions are not
325 considered a strongly negative factor for the youngest group, with a positive
326 parameter relative to coal. Respondents over the age of 50 were found to
327 show a strong aversion to emissions relative to their younger counterparts.
328 There may be a health component associated with this difference.

329

Table 5: Standard Logit (by Age Brackets) - with Demographic Weights

Parameter	Value	SE
Cost-YA (\$ x10)	-0.07773	0.0143
Emissions-YA (Level)	0.09870	0.0364
Distance-YA (km x10)	-0.002529	0.0261
Cost-MA (\$ x10)	0.02159	0.0241
Emissions-MA (Level)	-0.01301	0.0508
Distance-MA (km x10)	0.1208	0.0273
Cost-SA (\$ x10)	0.004421	0.0105
Emissions-SA (Level)	-0.1474	0.0212
Distance-SA (km x10)	-0.04137	0.0137
Biomass Constant	0.6787	0.0933
Coal Constant (Fixed)	0.0000	0.000
Natural Gas Constant	0.00712	0.109
Hydro Constant	0.6927	0.106
Large Wind Constant	0.6703	0.101
Small Wind Constant	0.3915	0.0981
Large Solar Constant	0.3660	0.0970
Small Solar Constant	0.5892	0.106
Nuclear Constant	0.1200	0.0963

330 A model was developed with alternative-specific constants broken out by
331 province of residence. Alberta and Saskatchewan are fairly similar in their
332 generation mix, but the British Columbia system is dominated by hydro
333 dams. This model was developed to test for heterogeneity resulting from
334 exposure to different electricity mixes and other local effects on preference.
335 Cost, emissions, and distance sensitivity were assumed constant between
336 provinces. Significant differences were found across most source-province
337 pairs (at 90% CI), with the exception of natural gas between BC-AB and
338 BC-SK, large solar array between BC-SK, and nuclear between BC-SK. A
339 large difference was found in preference for biomass between British Columbia
340 and Alberta. There is a wide set of possible explanations for this difference
341 and the following is a non-exhaustive list. Both jurisdictions currently have
342 biomass plants in operation (ref), but there may be differences in the prox-
343 imity of respondents to plants and perceptions developed through local con-
344 troversy. The definition of biomass may vary between the two provinces due
345 to differences in the mass burned at plants and information presented to res-

346 idents of each province. British Columbia may burn waste mass that would
347 otherwise be land filled, while plants in Alberta may burn feed products that
348 are perceived as having more valuable uses. This could induce a difference
349 in the choice of respondents between these two provinces.

350

Table 6: Standard Logit (by Province of Residence) - with Demographic Weights

Parameter	Value	SE
Cost(\$ x10)	-0.01821	0.0101
Emissions (Level)	-0.1184	0.0213
Distance (km x10)	-0.01448	0.0136
Biomass Constant-BC	0.7227	0.0931
Coal Constant-BC (Fixed)	0.0000	0.000
Natural Gas Constant-BC	0.08046	0.109
Hydro Constant-BC	0.7763	0.106
Large Wind Constant-BC	0.7101	0.100
Small Wind Constant-BC	0.4183	0.0984
Large Solar Constant-BC	0.4220	0.0957
Small Solar Constant-BC	0.6880	0.105
Nuclear Constant-BC	0.1551	0.0962
Biomass Constant-AB	0.7227	0.0931
Coal Constant-AB (Fixed)	0.0000	0.000
Natural Gas Constant-AB	0.08046	0.109
Hydro Constant-AB	0.7763	0.106
Large Wind Constant-AB	0.7101	0.100
Small Wind Constant-AB	0.4183	0.0984
Large Solar Constant-AB	0.4220	0.0957
Small Solar Constant-AB	0.6880	0.105
Nuclear Constant-AB	0.1551	0.0962
Biomass Constant-SK	0.7227	0.0931
Coal Constant-SK (Fixed)	0.0000	0.000
Natural Gas Constant-SK	0.08046	0.109
Hydro Constant-SK	0.7763	0.106
Large Wind Constant-SK	0.7101	0.100
Small Wind Constant-SK	0.4183	0.0984
Large Solar Constant-SK	0.4220	0.0957
Small Solar Constant-SK	0.6880	0.105
Nuclear Constant-SK	0.1551	0.0962

351 The final analysis was a novel formulation based on the hypothesis that
352 distance sensitivity is heterogeneous by the source of generation. The rea-
353 sons for this heterogeneity range from the health effects of plant emissions, to
354 aesthetic perceptions of locating a plant near one's residence. In this formula-

355 tion distance was distinguished by the source of generation. In this analysis,
356 only hydro was perceived positively relative to coal-fired power. Large-scale
357 solar was also viewed positively, but narrowly failed the test for significance
358 at a 90% CI. The results of the sensitivity test by generation source can be
359 interpreted with a positive value meaning a preference for having the source
360 further from one's residence and a negative value denoting a low sensitivity
361 to a particular plant being near one's residence. With this interpretation,
362 nuclear is considered the least desirable and preference is for it to be located
363 as far as possible from residences. It is considered acceptable to have a large-
364 scale solar array in close proximity to residences. However, results suggest
365 small-scale solar is less desirable than its larger counterpart and coal-fired
366 plants are the most acceptable for placement near residences. These results
367 are in contrast to the expectation of the researcher. The size of the sample
368 suggests this result was not the result of insufficient data. A total of 454
369 situations were presented to respondents with coal-fired plants included as
370 an alternative, from which it was chosen 51% of the time. This choice rate is
371 below only those of biomass, large-scale wind, and large-scale solar. It was
372 suspected this discrepancy arose from preference among those in Alberta and
373 Saskatchewan, where coal-fired power plants are dominant, for this source.
374 The provincially-differentiated model was run again, with the biomass con-
375 stant fixed the coal constant allowed to vary. This analysis showed a strong
376 negative coefficient for coal in British Columbia (-1.032) compared to a sta-
377 tistically significant value of 0.4786 for Alberta and a value for Saskatchewan
378 not significantly different from 0.000. In both cases, the difference of juris-
379 dictions with coal-fired plants (Alberta and Saskatchewan) was statistically
380 significant and positive compared with that of British Columbia.

Table 7: Standard Logit (distance by generation type) - with Demographic Weights

Parameter	Value	SE
Cost(\$ x10)	-0.01420	0.00809
Emissions (Level)	-0.04132	0.0180
Distance-Biomass (km x10)	-0.1340	0.0406
Distance-Coal (km x10)	-0.2673	0.0400
Distance-Natural Gas (km x10)	-0.06367	0.0345
Distance-Hydro (km x10)	-0.09498	0.0453
Distance-Large Wind (km x10)	-0.02340	0.0302
Distance-Small Wind (km x10)	-0.003398	0.0318
Distance-Large Solar (km x10)	-0.1057	0.0273
Distance-Small Solar (km x10)	-0.03545	0.0367
Distance-Nuclear (km x10)	-0.1202	0.0325
Biomass Constant	0.05009	0.121
Coal Constant (Fixed)	0.0000	0.000
Natural Gas Constant	-0.5054	0.138
Hydro Constant	0.2112	0.126
Large Wind Constant	0.1639	0.131
Small Wind Constant	-0.1047	0.129
Large Solar Constant	0.2023	0.133
Small Solar Constant	0.1197	0.130
Nuclear Constant	-0.4702	0.127

381 *4.1. Environmental Bias in Respondents*

382 Several demographic characteristics were obtained from survey respon-
383 dents, but were not incorporated into the model. These factors still warrant
384 discussion as to their effect on biases in the results. Previous studies on the
385 subject have shown a strong bias towards environmentally-conscious respon-
386 dents. Figure 2g shows a tendency of respondents towards liberalism, but a
387 moderate sample of conservative respondents. Two questions were asked to
388 describe environmental-consciousness of respondents:

- 389 • Have you given money to an environmental group in the past year?
- 390 • Do you currently pay a premium on your electricity bill for a renewable
391 energy portfolio or purchase electricity through a renewables provider
392 such as Bullfrog Power?

393 These data suggest %15 of respondents make contributions to environmen-
 394 tal groups and %5 pay for a premium program for a renewable electricity
 395 portfolio. These rates are lower than those indicated in previous studies, but
 396 remain above the findings of Statistics Canada across the population. They
 397 reported charitable giving to environmental causes among %7 of the popu-
 398 lation [15]. It is suggested survey responses are biased by self-selection, but
 399 that this bias is sufficiently small to not warrant adjustment of results.

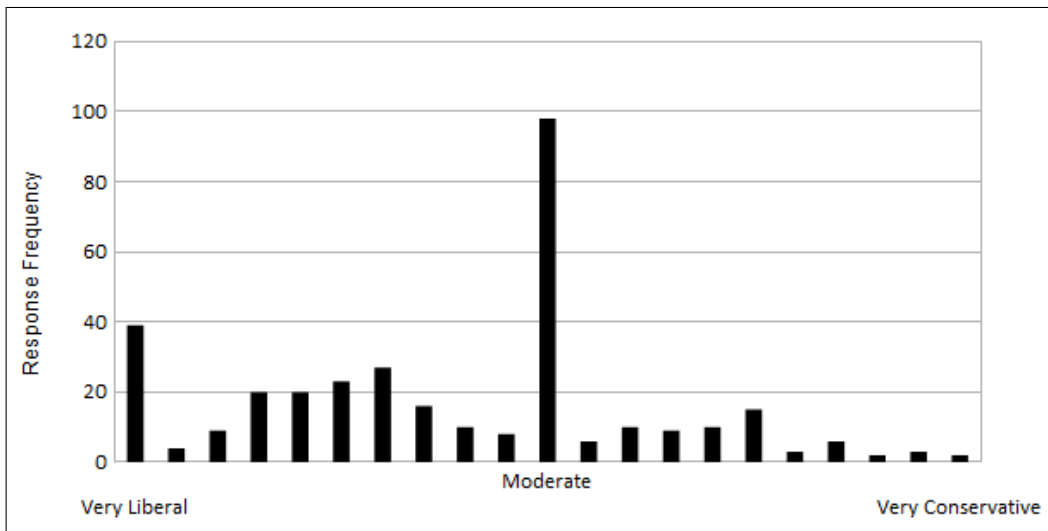


Figure 2: Figure caption

400 5. Conclusion and Future Work

401 The results of this study suggest a heterogeneity of preference between
 402 provinces, likely resulting from present exposure to sources of electricity gen-
 403 eration. The validity of the ultimate objective of this research is questionable
 404 with the present data. Results for the sensitivity of respondents to distance
 405 do not show the relationships one would expect given previous survey re-
 406 sults as to the generation preferences of the public. It is suggested that a
 407 number of changes may be necessary to the survey design to ensure more
 408 consistent results. Firstly, the use of a marginal price of energy may be
 409 misleading to survey respondents as this is not the price they see on their
 410 monthly bill. It may be advisable to present the total cost to respondents
 411 and draw-out the marginal cost of energy based on reporting from utility
 412 provides in post processing. Inconsistencies in the distance results may be

413 a result of biases in the sample population or errors resulting from multiple
414 responses by the same respondents. The current implementation does not
415 provide a method of ensuring a single response from each respondent. A
416 paper-based method would provide more confidence in the sample set. The
417 sample size obtained is within the bounds of other studies in the literature,
418 but a larger sample would allow for more statistically robust break-outs of
419 the data by demographic group. It is also suggested a larger sample of more
420 senior demographics be taken to reduce the weights applied to these samples
421 in model estimation.

422 It is desirable to have robust results from which a choice model can be derived.
423 The model described above, representing a distributed electricity network has
424 potential as a source of insight for researchers and utility providers. Data
425 representing the electricity consumption of ENMAX customers in Calgary,
426 Alberta and its surrounding communities was provided to the researcher.
427 This data has been expanded to a representation of the three provinces and
428 a base choice model developed. The model allocates generation sources based
429 on local preferences, the demand for electricity in the area, and existing gen-
430 eration sources requested by adjacent areas in previous steps of the model
431 run. These types of results would provide a representation of a hypothetical
432 network of small-scale and renewable generation, with the ability to address
433 the climatic impacts of our current electricity system. Such a representation
434 does not exist to the best knowledge of this author.

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441

442 **7. Survey Link**

443 <https://elec-survey.herokuapp.com/electricity-preferences/start/>

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