[INSERT RESULT] If All Eligible Voters Had Voted in the 2019 Canadian Federal Election

Zakir Chaudry

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Abstract

In this paper we will be using MRP Modeling on the CES data using the GSS 2017 data as a post-stratification dataset to see what the results of the election would be if everyone had voted. We then relay the results (currently unknown, add later) and discuss the potential implications of these findings, as well as any weaknesses/opportunities for future improvement.

Keywords: MRP; 2019 Canadian Federal Election; Eligible Voter; [Winner of Election]

Introduction

Elections are one of the most vital events of the modern age - a submission of votes representing the will of the people, allowing members of the population to make major decisions from local, national, and even international scales. The importance of these events cannot be understated as they directly affect our lives, sometimes in small ways, sometimes much more so. As such, it's incredibly imperative that the "will of the people" mentioned above comes to fruition. In our current voting system, this is what's highlighted, making the majority of people happy with the result. However, can we really say the will of the people is truly being heard? There are many different issues contradicting this assumption, but perhaps is one of the most impactful is simply the lack of voting. In the 2019 Canadian Federal Election, roughly 66% (Turnout Reference) of Canadians reported voting. This is quite a lot at first glance, but that's still 34% of people that are not being accounted for. Frankly speaking it's hard to support the notion that the election was the will of the people given that so many people's votes weren't even heard. However, what if this wasn't the case? What if every single person that could vote did so? What then? Would the result change? Or are the final results truly the will of the people all along. In this report, we will be using MRP (MRP Reference) Modeling to show what could have happened, in aims to answer these questions and go beyond.

Data

CES Data

The data used to generate the model was taken from the 2019 Canadian Election Study. The Canadian Election Study is a large-scale survey conducted on each election year, going back to as early as 1965 (CES site). Its purpose is to give a greater insight into the electoral democracy in Canada by measuring many sorts of details. The data for this report was taken from the 2019 Study, in particular the data gathered from the online survey component of the study. The questionnaire for this study was hosted and conducted via the Qualtrics Platform (Qualtrics Platform) (Codebook), with the population being eligible voters in Canada.

We made use of 5 different variables in order to create our model. The independent variable we looked at was cps19_votechoice, which described which party the respondent was going to vote for. There were 8 choices

in response: "Green Party", "Conservative Party", "Liberal Party", "People's Party", "Bloc Québécois", "ndp", "Another party (please specify)", and "Don't know/ Prefer not to answer". For the model, we ended up removing last two options, as on the grand scale of things, neither of those two groups would impact the election as a whole. As such, we were left with 6 different parties to choose from. There was another option in terms of finding a variable describing the choice of party labeled pes19_votingchoice, which described who the respondents said they voted for after the election. This may have been a better choice in terms of what we wanted from the variable, but there simply was not enough data for this variable for this switch to have been worth it.

The first dependent variable we chose was cps19_age, which described the age of the respondent. We found that splitting the age into ranges would be better to see from an interpretation standpoint, so we split the variable into the following ranges: "18 to 24", "25 to 34", "35 to 44", "45 to 54", "55 to 64", "65 to 74", and "75 and above".

The next dependent variable we chose was cps19_education, which described the level of education the respondent had attained up to that point. There was a lot of reshuffling of data values for this variable, mainly due to the fact that the post-stratification dataset's education had a wildly different set of potential values. The initial values were [Insert Initial Values], but we ended up reorganizing them into the following values: "Less than High School", "High School", "Less than Bachelor's Degree", "Bachelor's Degree", and "Above Bachelor's Degree". While some information was lost, the ability to match up with the post-stratification dataset's education values and the simplicity from an observation standpoint made this a worthy endeavor.

The third dependent variable we chose was cps19_gender, which described the gender of the respondent. Again, there was an issue in terms of matching the post-stratification set, specifically in terms of non-cisgender respondents. The post-stratification set has only male or female options available, as it uses sex rather than gender. Ultimately, we dropped the non-cisgender respondents, as like the voting choices, their impact was negligible relatively speaking (Cis Population).

Finally, our last dependent variable was cps19_province. We found that province was a very important variable as there can be great variation across provinces regarding political choice. Perhaps the largest change was that the post-stratification dataset did not contain data on the Northwest Territories, Nunavut, and Yukon. While this at first may seem like a reason to not use this variable, we found that the province of the respondent to be very important and stripped away the 3 options not found. Similarly, we're not losing much (Province Population).

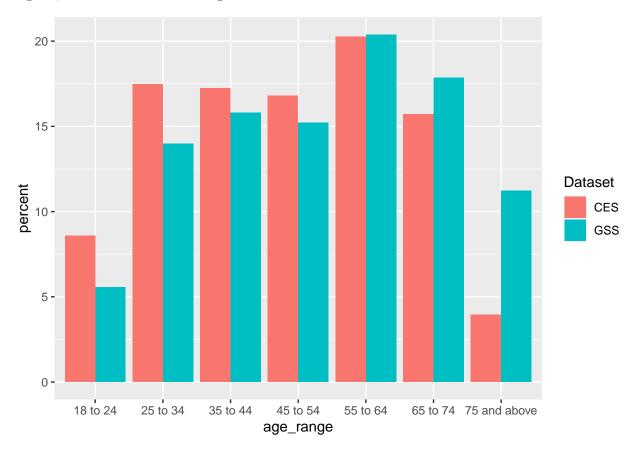
GSS Data

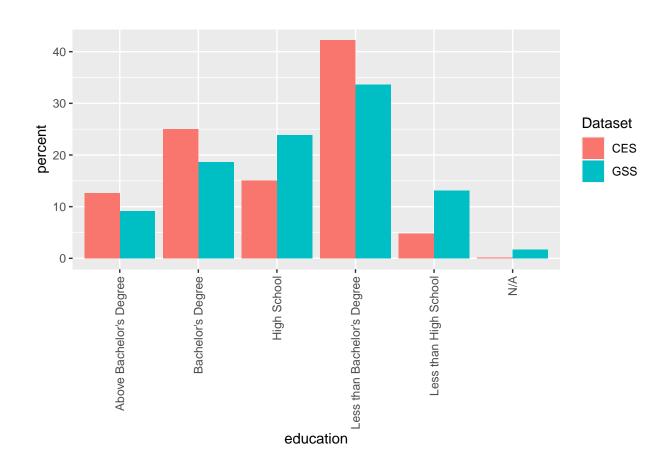
The data used in this report was curated from the General Social Survey (GSS) program., specifically the results of the "General social survey on Family" from 2017. Unfortunately, we cannot provide the data itself, as it is restricted to only those that are allowed to view it. However, if you are a UofT student or have a UofT login, you can follow the steps outlined in "gss_cleaning-1.R" located in the git repository to acquire and clean the data for use.

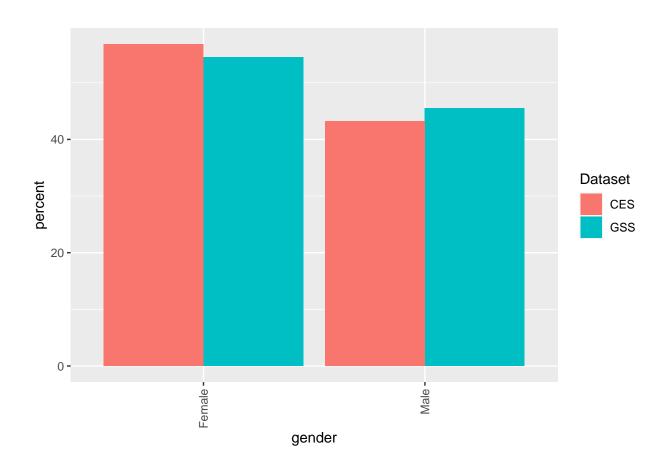
As stated in the overview for the GSS, the target population consisted of those aged 15 and over across all the provinces in Canada, apart from full-time residents of institutions. For this survey, the sample size was approximately 20,000 people, done via Stratified Random Sampling, where the strata were geographic areas within each province. The frame consisted of two aspects: the list of telephone numbers in use available to Statistics Canada and the list of all dwellings within the ten provinces.

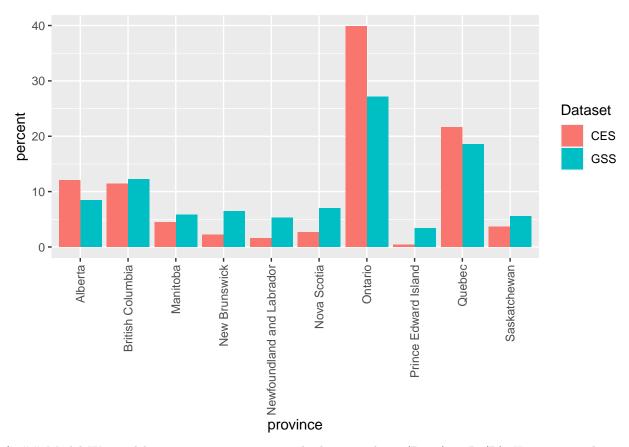
Respondents were contacted via computer assisted telephone interviews. There were many measures for combating non-response. One of which was the resilience shown by the interviewers, including calling up to twice more to a respondent who initially refused, outlining the importance of the survey. In addition, numerous calls were made to those that didn't pick up. In addition, when dealing with actual non-response, it was not permitted for questions that required weighting. Furthermore, the non-response adjusted accordingly depending on the level of information available.

The dependent variables were the same as from the CES data, with the variable names being age, education, sex, and province. Age and education were the only two variables that had to have refactoring. Age was split into age ranges exactly as before. Education again was a struggle to work through, but was transformed into the same list of values: "Less than High School", "High School", "Less than Bachelor's Degree", "Bachelor's Degree", and "Above Bachelor's Degree".









\ ## Model We used bayesian regression using the brms package (Brms) in R (R). However, we have 6 parties to deal with, which can be hard to deal with given all of our categorical variables. So, we actually created 6 different models, with each one's independent variable being a vector of binary values, with a value of 1 for the party in question and 0 for the rest.

The formula for each was (Party) ~ age range + education + gender + province.

Results

Our final results were the following:

```
Family: bernoulli
##
##
     Links: mu = logit
  Formula: Green ~ age_range + education + gender + cps19_province
##
##
      Data: ces (Number of observations: 26146)
  Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
##
##
            total post-warmup samples = 4000
##
## Population-Level Effects:
##
                                          Estimate Est.Error 1-95% CI u-95% CI Rhat
                                              -2.23
                                                                  -2.47
                                                                           -2.00 1.01
## Intercept
                                                         0.12
                                              -0.40
                                                         0.08
                                                                 -0.55
                                                                           -0.26 1.00
## age_range25to34
                                              -0.62
## age_range35to44
                                                         0.08
                                                                 -0.77
                                                                           -0.46 1.00
                                              -0.64
                                                         0.08
                                                                 -0.80
                                                                           -0.48 1.00
## age_range45to54
                                              -0.75
                                                                  -0.90
## age_range55to64
                                                         0.08
                                                                           -0.60 1.00
                                              -0.74
                                                         0.08
                                                                  -0.91
                                                                           -0.57 1.00
## age_range65to74
```

```
## age_range75andabove
                                             -1.03
                                                         0.14
                                                                 -1.32
                                                                           -0.76 1.00
                                             -0.21
                                                         0.07
                                                                 -0.35
                                                                           -0.07 1.00
## educationBachelorsDegree
                                                                 -0.37
## educationHighSchool
                                             -0.21
                                                         0.08
                                                                           -0.05 1.00
## educationLessthanBachelorsDegree
                                             -0.12
                                                         0.07
                                                                 -0.25
                                                                           0.01 1.00
## educationLessthanHighSchool
                                             -0.16
                                                         0.11
                                                                 -0.39
                                                                           0.06 1.00
                                                         0.05
                                                                 -0.30
## genderMale
                                             -0.21
                                                                          -0.12 1.00
## cps19_provinceBritishColumbia
                                              1.32
                                                         0.10
                                                                  1.12
                                                                           1.53 1.00
## cps19_provinceManitoba
                                              0.70
                                                         0.14
                                                                  0.43
                                                                           0.97 1.00
## cps19_provinceNewBrunswick
                                              1.72
                                                         0.13
                                                                  1.46
                                                                            1.97 1.00
## cps19_provinceNewfoundlandandLabrador
                                             -0.40
                                                         0.29
                                                                 -1.01
                                                                           0.12 1.00
## cps19_provinceNovaScotia
                                              1.23
                                                         0.14
                                                                  0.96
                                                                            1.51 1.00
                                                                  0.53
## cps19_provinceOntario
                                              0.71
                                                         0.10
                                                                            0.90 1.01
## cps19_provincePrinceEdwardIsland
                                              2.01
                                                         0.25
                                                                  1.52
                                                                            2.49 1.00
## cps19_provinceQuebec
                                              0.62
                                                         0.10
                                                                  0.43
                                                                           0.82 1.00
## cps19_provinceSaskatchewan
                                              0.16
                                                                 -0.15
                                                                            0.48 1.00
                                                         0.16
##
                                          Bulk_ESS Tail_ESS
## Intercept
                                               1086
                                                        1989
## age range25to34
                                              2062
                                                        2795
                                              1815
                                                        2746
## age_range35to44
## age range45to54
                                              1882
                                                        2545
## age_range55to64
                                              2000
                                                        2937
## age_range65to74
                                                        2426
                                              1859
## age_range75andabove
                                              3176
                                                        3111
## educationBachelorsDegree
                                              2508
                                                        2662
## educationHighSchool
                                              2595
                                                        2998
## educationLessthanBachelorsDegree
                                              2231
                                                        2718
## educationLessthanHighSchool
                                              3124
                                                        2946
## genderMale
                                              4816
                                                        2868
## cps19_provinceBritishColumbia
                                               1421
                                                        2118
## cps19_provinceManitoba
                                              2202
                                                        2715
## cps19_provinceNewBrunswick
                                               1868
                                                        2622
## cps19_provinceNewfoundlandandLabrador
                                              3501
                                                        2817
## cps19_provinceNovaScotia
                                              2065
                                                        2699
## cps19_provinceOntario
                                               1361
                                                        2123
## cps19_provincePrinceEdwardIsland
                                               3378
                                                        2913
                                                        2027
## cps19_provinceQuebec
                                              1390
## cps19_provinceSaskatchewan
                                              2525
                                                        2985
## Samples were drawn using sampling(NUTS). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
    Family: bernoulli
##
     Links: mu = logit
## Formula: Conservative ~ age_range + education + gender + cps19_province
      Data: ces (Number of observations: 26146)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
            total post-warmup samples = 4000
##
##
## Population-Level Effects:
##
                                          Estimate Est.Error 1-95% CI u-95% CI Rhat
                                             -0.69
                                                         0.08
                                                                 -0.85
                                                                           -0.54 1.00
## Intercept
## age_range25to34
                                              0.50
                                                         0.07
                                                                  0.37
                                                                            0.63 1.00
                                              0.78
                                                         0.07
                                                                  0.65
## age_range35to44
                                                                            0.91 1.00
```

```
## age_range45to54
                                              0.91
                                                         0.07
                                                                  0.78
                                                                           1.04 1.00
## age_range55to64
                                              0.91
                                                         0.07
                                                                  0.78
                                                                           1.03 1.00
                                                         0.07
                                                                  0.77
## age range65to74
                                              0.91
                                                                           1.04 1.00
## age_range75andabove
                                                         0.09
                                                                           1.33 1.00
                                              1.16
                                                                  0.99
## educationBachelorsDegree
                                              0.20
                                                         0.05
                                                                  0.10
                                                                           0.30 1.00
## educationHighSchool
                                              0.56
                                                         0.05
                                                                  0.46
                                                                           0.67 1.00
## educationLessthanBachelorsDegree
                                              0.41
                                                         0.05
                                                                  0.33
                                                                           0.51 1.00
## educationLessthanHighSchool
                                              0.40
                                                         0.08
                                                                  0.25
                                                                           0.55 1.00
## genderMale
                                              0.41
                                                         0.03
                                                                  0.35
                                                                           0.47 1.00
## cps19_provinceBritishColumbia
                                             -1.40
                                                         0.06
                                                                 -1.51
                                                                          -1.29 1.00
## cps19_provinceManitoba
                                             -0.92
                                                         0.07
                                                                 -1.06
                                                                          -0.78 1.00
## cps19_provinceNewBrunswick
                                             -1.54
                                                         0.10
                                                                 -1.74
                                                                          -1.34 1.00
## cps19_provinceNewfoundlandandLabrador
                                             -1.74
                                                                 -1.97
                                                                          -1.501.00
                                                         0.12
## cps19_provinceNovaScotia
                                             -1.89
                                                         0.10
                                                                 -2.09
                                                                          -1.701.00
                                                                 -1.45
## cps19_provinceOntario
                                             -1.36
                                                         0.04
                                                                          -1.28 1.00
## cps19_provincePrinceEdwardIsland
                                             -1.97
                                                         0.26
                                                                 -2.50
                                                                           -1.48 1.00
                                             -2.16
                                                                 -2.26
## cps19_provinceQuebec
                                                         0.05
                                                                          -2.05 1.00
## cps19_provinceSaskatchewan
                                             -0.38
                                                         0.07
                                                                 -0.53
                                                                          -0.24 1.00
                                          Bulk_ESS Tail_ESS
##
## Intercept
                                              1402
                                                        1863
## age_range25to34
                                              1466
                                                        2018
                                                        2234
## age_range35to44
                                              1482
## age_range45to54
                                              1438
                                                        2133
## age_range55to64
                                              1424
                                                        2012
## age_range65to74
                                              1436
                                                        2256
## age_range75andabove
                                              2001
                                                        2181
                                              2593
## educationBachelorsDegree
                                                        2577
## educationHighSchool
                                              2929
                                                        2740
## educationLessthanBachelorsDegree
                                              2593
                                                        2557
## educationLessthanHighSchool
                                              3076
                                                        2818
## genderMale
                                              4804
                                                        2849
## cps19_provinceBritishColumbia
                                              2301
                                                        2521
## cps19_provinceManitoba
                                              3060
                                                        3050
## cps19_provinceNewBrunswick
                                              3455
                                                        2320
## cps19_provinceNewfoundlandandLabrador
                                              3824
                                                        2992
## cps19_provinceNovaScotia
                                              3040
                                                        3093
## cps19 provinceOntario
                                               1911
                                                        2555
## cps19_provincePrinceEdwardIsland
                                                        3041
                                              4760
## cps19_provinceQuebec
                                                        2674
                                              2263
## cps19_provinceSaskatchewan
                                              2817
                                                        2990
## Samples were drawn using sampling(NUTS). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
   Family: bernoulli
##
    Links: mu = logit
## Formula: Liberal ~ age_range + education + gender + cps19_province
      Data: ces (Number of observations: 26146)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
##
            total post-warmup samples = 4000
##
## Population-Level Effects:
##
                                          Estimate Est.Error 1-95% CI u-95% CI Rhat
```

```
## Intercept
                                              -1.27
                                                         0.07
                                                                 -1.42
                                                                           -1.12 1.00
                                              -0.04
                                                         0.06
                                                                 -0.15
                                                                            0.07 1.00
## age_range25to34
## age range35to44
                                              0.06
                                                         0.06
                                                                 -0.05
                                                                            0.17 1.00
## age_range45to54
                                              0.06
                                                         0.06
                                                                 -0.05
                                                                            0.17 1.00
## age_range55to64
                                              0.22
                                                         0.05
                                                                  0.11
                                                                            0.32 1.00
                                                                  0.16
## age range65to74
                                              0.27
                                                         0.06
                                                                            0.39 1.00
## age range75andabove
                                              0.26
                                                         0.08
                                                                  0.11
                                                                            0.41 1.00
## educationBachelorsDegree
                                              -0.07
                                                         0.04
                                                                 -0.15
                                                                            0.02 1.00
## educationHighSchool
                                              -0.62
                                                         0.05
                                                                 -0.72
                                                                           -0.52 1.00
## educationLessthanBachelorsDegree
                                              -0.43
                                                         0.04
                                                                 -0.52
                                                                           -0.351.00
## educationLessthanHighSchool
                                              -0.66
                                                         0.07
                                                                 -0.81
                                                                           -0.52 1.00
                                                                           -0.06 1.00
## genderMale
                                              -0.12
                                                         0.03
                                                                 -0.17
## cps19_provinceBritishColumbia
                                              0.72
                                                         0.06
                                                                  0.60
                                                                            0.84 1.00
## cps19_provinceManitoba
                                                         0.08
                                              0.68
                                                                  0.53
                                                                            0.83 1.00
## cps19_provinceNewBrunswick
                                               1.07
                                                                  0.88
                                                         0.10
                                                                            1.25 1.00
## cps19_provinceNewfoundlandandLabrador
                                               1.51
                                                         0.11
                                                                  1.30
                                                                            1.72 1.00
## cps19_provinceNovaScotia
                                               1.35
                                                         0.09
                                                                  1.18
                                                                            1.53 1.00
## cps19 provinceOntario
                                               1.07
                                                         0.05
                                                                  0.97
                                                                            1.17 1.00
## cps19_provincePrinceEdwardIsland
                                                         0.22
                                               1.22
                                                                  0.79
                                                                            1.64 1.00
## cps19 provinceQuebec
                                               0.96
                                                         0.05
                                                                  0.85
                                                                            1.07 1.00
## cps19_provinceSaskatchewan
                                              -0.25
                                                         0.11
                                                                 -0.47
                                                                           -0.05 1.00
                                          Bulk ESS Tail ESS
                                               1473
                                                        1980
## Intercept
                                                        2494
## age range25to34
                                               1816
## age_range35to44
                                               1942
                                                        2518
## age_range45to54
                                               1991
                                                        2595
                                               1921
                                                        2318
## age_range55to64
## age_range65to74
                                               2007
                                                        2256
## age_range75andabove
                                               2464
                                                        3007
## educationBachelorsDegree
                                               2264
                                                        2338
## educationHighSchool
                                               2354
                                                        2499
## educationLessthanBachelorsDegree
                                               1963
                                                        1739
## educationLessthanHighSchool
                                               3040
                                                        3080
                                                        2953
## genderMale
                                               3721
## cps19_provinceBritishColumbia
                                               1985
                                                        2505
## cps19_provinceManitoba
                                               1932
                                                        2799
## cps19 provinceNewBrunswick
                                               2568
                                                        2351
## cps19_provinceNewfoundlandandLabrador
                                               2849
                                                        2833
## cps19_provinceNovaScotia
                                               2507
                                                        2815
## cps19_provinceOntario
                                               1463
                                                        2121
## cps19 provincePrinceEdwardIsland
                                               4160
                                                        2983
## cps19_provinceQuebec
                                                        2443
                                               1717
## cps19_provinceSaskatchewan
                                               3307
                                                        3043
##
## Samples were drawn using sampling(NUTS). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
## Warning: There were 535 divergent transitions after warmup. Increasing
## adapt_delta above 0.8 may help. See http://mc-stan.org/misc/
## warnings.html#divergent-transitions-after-warmup
    Family: bernoulli
    Links: mu = logit
##
```

```
## Formula: Peoples ~ age_range + education + gender + cps19_province
      Data: ces (Number of observations: 26146)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
            total post-warmup samples = 4000
##
## Population-Level Effects:
                                          Estimate Est.Error 1-95% CI u-95% CI Rhat
                                                         0.22
                                                                 -4.46
                                                                           -3.61 1.00
## Intercept
                                             -4.04
## age_range25to34
                                              0.28
                                                         0.16
                                                                 -0.03
                                                                            0.60 1.01
                                             -0.02
                                                                 -0.34
## age_range35to44
                                                         0.17
                                                                            0.31 1.01
## age_range45to54
                                             -0.06
                                                         0.17
                                                                 -0.38
                                                                           0.29 1.00
## age_range55to64
                                             -0.56
                                                                 -0.88
                                                         0.18
                                                                           -0.201.01
## age_range65to74
                                             -0.93
                                                         0.20
                                                                 -1.33
                                                                          -0.541.01
                                                         0.30
                                                                 -1.41
                                                                          -0.24 1.00
## age_range75andabove
                                             -0.80
## educationBachelorsDegree
                                             -0.19
                                                         0.16
                                                                 -0.51
                                                                           0.11 1.01
## educationHighSchool
                                              0.48
                                                         0.15
                                                                  0.18
                                                                           0.77 1.01
                                                                  0.06
## educationLessthanBachelorsDegree
                                              0.33
                                                         0.14
                                                                           0.61 1.01
## educationLessthanHighSchool
                                              0.91
                                                         0.19
                                                                  0.53
                                                                           1.29 1.01
                                                         0.08
                                                                           0.67 1.00
## genderMale
                                              0.50
                                                                  0.33
## cps19_provinceBritishColumbia
                                             -0.10
                                                         0.17
                                                                 -0.43
                                                                           0.24 1.00
## cps19_provinceManitoba
                                             -0.58
                                                         0.27
                                                                 -1.15
                                                                          -0.07 1.00
## cps19_provinceNewBrunswick
                                              0.41
                                                         0.25
                                                                 -0.09
                                                                           0.90 1.00
## cps19_provinceNewfoundlandandLabrador
                                             -0.83
                                                         0.48
                                                                 -1.84
                                                                           0.02 1.01
## cps19 provinceNovaScotia
                                                                 -0.47
                                                                            0.60 1.01
                                              0.09
                                                         0.28
                                                                 -0.21
## cps19_provinceOntario
                                              0.04
                                                         0.13
                                                                           0.30 1.01
## cps19_provincePrinceEdwardIsland
                                           -775.36
                                                       913.46 -3348.89
                                                                         -17.32 1.01
## cps19_provinceQuebec
                                             -0.07
                                                         0.15
                                                                 -0.36
                                                                           0.22 1.01
## cps19_provinceSaskatchewan
                                              0.07
                                                         0.23
                                                                 -0.43
                                                                            0.49 1.01
##
                                          Bulk_ESS Tail_ESS
## Intercept
                                               320
                                                         653
## age_range25to34
                                               281
                                                         564
## age_range35to44
                                               258
                                                         508
## age_range45to54
                                               297
                                                         511
                                               338
                                                         735
## age_range55to64
## age range65to74
                                               362
                                                         769
## age_range75andabove
                                               556
                                                         910
## educationBachelorsDegree
                                               552
                                                        1026
## educationHighSchool
                                               528
                                                        1380
## educationLessthanBachelorsDegree
                                               543
                                                        1160
## educationLessthanHighSchool
                                                         982
                                               514
## genderMale
                                               1226
                                                        1714
## cps19_provinceBritishColumbia
                                               660
                                                        1053
## cps19_provinceManitoba
                                               753
                                                        1059
## cps19_provinceNewBrunswick
                                               798
                                                        1319
## cps19_provinceNewfoundlandandLabrador
                                               773
                                                        1085
## cps19_provinceNovaScotia
                                               782
                                                        1105
## cps19_provinceOntario
                                               474
                                                         639
## cps19_provincePrinceEdwardIsland
                                               509
                                                         460
## cps19_provinceQuebec
                                               520
                                                         846
## cps19_provinceSaskatchewan
                                               719
                                                         765
##
## Samples were drawn using sampling(NUTS). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
```

```
Family: bernoulli
    Links: mu = logit
##
## Formula: NDP ~ age_range + education + gender + cps19_province
      Data: ces (Number of observations: 26187)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
            total post-warmup samples = 4000
##
## Population-Level Effects:
##
                                           Estimate Est.Error 1-95% CI u-95% CI Rhat
                                                                  -1.40
## Intercept
                                              -1.23
                                                         0.09
                                                                           -1.05 1.00
## age_range25to34
                                              -0.27
                                                         0.06
                                                                  -0.38
                                                                           -0.15 1.00
                                              -0.57
                                                         0.06
                                                                  -0.69
                                                                           -0.44 1.00
## age_range35to44
## age_range45to54
                                              -0.83
                                                         0.06
                                                                  -0.95
                                                                           -0.70 1.00
## age_range55to64
                                             -1.15
                                                         0.06
                                                                  -1.27
                                                                           -1.021.00
                                              -1.28
                                                         0.07
                                                                  -1.42
                                                                           -1.14 1.00
## age_range65to74
## age_range75andabove
                                              -1.57
                                                         0.13
                                                                  -1.85
                                                                           -1.33 1.00
                                              -0.04
                                                         0.06
                                                                  -0.16
## educationBachelorsDegree
                                                                            0.08 1.00
## educationHighSchool
                                               0.07
                                                         0.07
                                                                  -0.06
                                                                            0.20 1.00
## educationLessthanBachelorsDegree
                                                         0.06
                                                                   0.00
                                                                            0.23 1.00
                                               0.11
## educationLessthanHighSchool
                                               0.21
                                                         0.09
                                                                   0.04
                                                                            0.38 1.00
## educationNDA
                                               0.07
                                                         0.42
                                                                  -0.80
                                                                            0.87 1.00
## genderMale
                                              -0.44
                                                         0.04
                                                                  -0.52
                                                                           -0.37 1.00
                                               0.76
                                                         0.07
                                                                   0.62
                                                                            0.90 1.00
## cps19_provinceBritishColumbia
## cps19 provinceManitoba
                                                                   0.36
                                               0.55
                                                         0.10
                                                                            0.73 1.00
## cps19_provinceNewBrunswick
                                              -0.35
                                                         0.16
                                                                  -0.68
                                                                           -0.05 1.00
## cps19_provinceNewfoundlandandLabrador
                                               0.78
                                                         0.13
                                                                   0.51
                                                                            1.04 1.00
## cps19_provinceNovaScotia
                                               0.39
                                                         0.12
                                                                   0.16
                                                                            0.62 1.00
## cps19_provinceOntario
                                               0.54
                                                         0.06
                                                                   0.42
                                                                            0.66 1.00
## cps19_provincePrinceEdwardIsland
                                                                  -0.79
                                              -0.13
                                                         0.32
                                                                            0.46 1.00
## cps19_provinceQuebec
                                              -0.02
                                                         0.07
                                                                  -0.16
                                                                            0.12 1.00
## cps19_provinceSaskatchewan
                                               0.82
                                                         0.10
                                                                   0.64
                                                                            1.01 1.00
##
                                           Bulk_ESS Tail_ESS
## Intercept
                                               1602
                                                        1725
                                               1753
                                                        2536
## age_range25to34
## age range35to44
                                               1874
                                                        2295
                                               1998
                                                        2462
## age_range45to54
## age range55to64
                                               2109
                                                        2641
## age_range65to74
                                               2229
                                                        2803
## age_range75andabove
                                               3263
                                                        2986
## educationBachelorsDegree
                                                        2687
                                               2181
## educationHighSchool
                                               2370
                                                        2545
## educationLessthanBachelorsDegree
                                               1758
                                                        2652
## educationLessthanHighSchool
                                               2627
                                                        2706
## educationNDA
                                               4397
                                                        2806
## genderMale
                                               4202
                                                        3121
## cps19_provinceBritishColumbia
                                                        2365
                                               1897
## cps19_provinceManitoba
                                               2821
                                                        2848
## cps19_provinceNewBrunswick
                                               3655
                                                        2777
## cps19_provinceNewfoundlandandLabrador
                                               3482
                                                        2861
## cps19_provinceNovaScotia
                                               3132
                                                        3234
                                                        2137
## cps19_provinceOntario
                                               1677
## cps19_provincePrinceEdwardIsland
                                               4336
                                                        2498
## cps19_provinceQuebec
                                               2023
                                                        2313
## cps19_provinceSaskatchewan
                                               2583
                                                        2605
```

```
##
## Samples were drawn using sampling(NUTS). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
```

Discussion

Appendix (?)

References