

Department of Statistics, the University of Auckland Summer Scholarship 2014–2015

Adjusting for linkage bias in the New Zealand Longitudinal Census

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Abstract

The aim of this project is to adjust for linkage bias in the New Zealand longitudinal census, a series of 15 cohorts linking the 1981, 1986, 1991, 1996, 2001 & 2006 censuses. These include five cohorts of two Censuses, four cohorts of three Censuses, three cohorts of four Censuses, two cohorts of five Censuses, and one cohort of six Censuses.

To determine bias we assessed 2-way (X-Y) correlations between children & adult variables for each cohort for (1) Full (linkable) Census at time t; (2) Sample linked from t to t-1, (3) Sample linked from t to t-1 weighted by each individuals propensity to be linked, by a logistic regression model including main effects only; and (4) Sample linked from t to t-1 weighted by each individuals propensity to be linked by a logistic regression model including main effects and two way interaction effects. We then calculated the magnitude of the differences between the correlations: 1 vs 2 (unweighted); 1 vs 3 (weighted-main); 1 vs 4 (weighted-interactions); and considered correlations to be unbiased if the magnitude was smaller than .01.

Across cohorts, 40–76% of correlations were unbiased in unweighted analyses. Weighting increased the number of unbiased correlations by 3 to 25 percentage points, and the weighted-interaction correlations tended to be less biased than the weighted-main correlations. For adults we can see that we have improvements ranging from about 4 to 25 percentage points. For children we can see that we have improvements ranging from about 4 to 19 percentage points, with the exception of one cohort.

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1.0 Introduction

The census is the official count of how many dwellings and people there are in New Zealand, and it covers the entire population. However it is limited in that it only takes a cross-sectional snapshot in time. The main benefit of a longitudinal study is that developments or changes in the characteristics of the target population are able to be detected by researchers, at both the group and the individual level. As a result of longitudinal studies extending beyond a single moment in time, we can establish sequences of events.

For example, we might choose to look at what factors explain changing ethnic identification. The longitudinal study design would account for variables such as age or gender as the ethnic identification changed over time. Therefore, a longitudinal study is more likely to suggest cause-and-effect relationships than a cross-sectional study by virtue of its scope. It will also become possible to answer questions such as what is the extent of ethnic mobility or is geographical mobility increasing in NZ?

Currently the NZLC contains the censuses from 1981–2006, where records have been "linked" back to the previous census. What this means is that individuals in the eligible population are "linked" back to a previous census, where the eligible population is define to be where the individual was (1) in New Zealand at the previous census and (2) old enough to have been alive at the last census.

The 15 cohorts of the NZLC are shown in Figure 1. These include five cohorts of two Censuses, four cohorts of three Censuses, three cohorts of four Censuses, two cohorts of five Censuses, and one cohort of six Censuses. We can see that there is incomplete linkage between Censuses, ranging from 31–75% of theoretical population linked, depending on the cohort. When we link people from one census to another, those people that have been linked may differ from those that could not be linked, such as their age, sex, and ethnic compositions of census pairs may differ across time in a way that has variable effects on research questions. Previous work undertaken by Vera Puti Puti Clarkson in a 2013–2014 summer scholarship found that the five strongest variables that determines linkage across the cohorts are: Same address 5 years ago, Martial Status, European Ethnicity, Live with partner and sex.

Having the bias can result in a tendency to overestimate or underestimate important relationships between variables, such as the effect of a person's occupation on mortality risk. This tendency could potentially result in incorrect conclusions. Thus this project could be very helpful for other projects that use the New Zealand Longitudinal Census to investigate the effect of different variables.

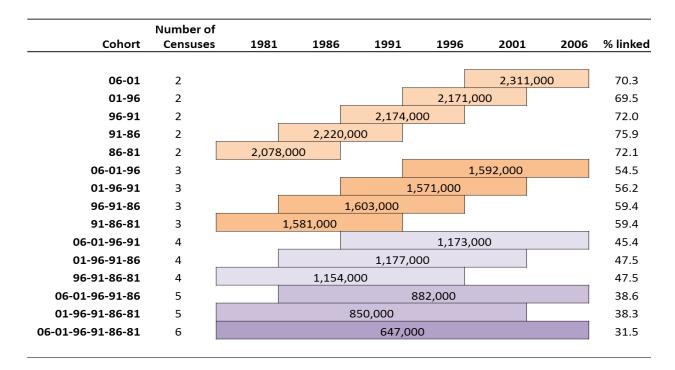


Figure 1. New Zealand Longitudinal Census cohorts

Weighting refers to the process trying to infer results for the relevant population by adjusting a sample. To do this, a 'weight' is allocated to each individual. The weight attempts to adjust for how many people in the relevant population are represented by each person in the sample. Weights allow for linked records to estimate longitudinal populations. The project "Developing Bias Weights for the New Zealand Longitudinal Census" is attempting to adjust for linkage bias in the New Zealand longitudinal census. This will be done by conducting analyses to estimate bias weights, and examining the extent to which adjusting for these weights results in unbiased analyses.

2.0 Methods

The program used to analyze the data was SAS Enterprise Guide.

For two census cohorts

Each two census pair file (i.e. 2006–2001, 2001–1996, 1996–1991, 1991–1986, 1986–1981) was created by merging the appropriate Census level files. Variables were then modified to change them all into numeric values, and categorised. We then separated the data into "adult" (age ≥15) and "child" (age <15) data set . Afterwards, we used the ranuni SAS function separately on both of these data sets, to randomise the data and then split the randomised data into two parts. The training set contained 70% of the data, and the test case contained 30% of the data. To assess linkage before adjusting for weights, we made a correlation matrix <u>using test cases only</u> for the full linkable Census in t (e.g. 2006) and the linked census from t to t-1 (e.g. 2006 to 2001) separately for adults and children, using the adult and children variables. We then assessed the magnitude of differences between the full linkable Census and the linked census correlations (weighted), for both the adults and children. We then used these magnitudes to determine how biased the cohorts are. If the difference in correlations was smaller than .01 we considered the correlation to be unbiased.

Note, we always compared correlations using data from the latter of the two linked Censuses (t), as all those in t are eligible to be linked back to t-1. Thus, we want correlations among those linked from t to t-1 to match as closely as possible correlations among those in t. The opposite is not the case: some in t-1 are not eligible to be liked to t (e.g. those who die or emigrate in the interim). As such, correlations among those linked from t to t-1 are not expected to match the correlations among those in t-1.

To adjust for weights we calculated each individual's probability to be linked, based on their characteristics. This was done using two logistic regression models, <u>run on the training data</u>. The first logistic regression model included main effects only (weighted-main). Predicted probabilities of being linked were output from this model. We then weighted observations by inverse of these probabilities in analyses. Correlation matrices using test cases only for the full linkable Census in t and the main-effects-weighted linked census from t to t-1 were made for adults and children, using the adult and children variables. We then assessed the magnitude of differences between the full linkable Census and the linked census correlations, for both the adults and children. We then used these magnitudes to determine how biased the cohorts were. If the difference in correlations was smaller than .01 we considered the correlation to be unbiased.

The second logistic regression model included both main effects and two-way interaction effects (weighted-interactions). Note that processing power did not allow the inclusion of all two-way interactions, so only those deemed 'important' were included. To determine 'important' interaction effects, we ran a proc surveyselect on the adults on a sample size of 14,500 to create a new data set (approximately 10,000 training cases and 4,500 test cases). Any two-variable interaction found to be significant was added into the logistic regression model in addition to the other adult variables. Thus, we considered any interaction significant in a random sample of 10,000 to be 'important' enough to include in the logistic model. Correlation matrices for the full linkable Census in t and the interaction-effects-weighted linked census from t to t-1 were made for adults, using the adult variables. We then assessed the magnitude of

differences between the full linkable Census and the linked census correlations. We then used these magnitudes to determine how biased the cohorts are. If the difference in correlations was smaller than .01 we considered the correlation to be unbiased. The child data set involved all the steps taken in the adult data set using instead the child data set and child variables.

For three and higher census cohorts:

The weights obtained in the second method above combined using two different methods, where the method that had the highest reduction in bias was used.

- The Arithmetic mean method: Calculated by adding the weights together and dividing by the number of censuses in the set. For example in the 060196 cohort we added the 0601 and 0196 weights, then divided by two to obtain the new weights.
- 2. Geometric mean: Calculated by multiplying the weights together and taking the number of censuses root. For example in the 060196 cohort we multiplied the 0601 and 0196 weights, then raised them to the 2nd root (square root).

For each method we then assessed the magnitude of differences between the full linkable Census and the Arithmetic mean or Geometric mean linked census correlations. We then used these magnitudes to determine how biased the cohorts are. If the difference in correlations was smaller than .01 we considered the correlation to be unbiased. This was undertaken separately for adults and children as before.

The three cohort and above censuses require some additional coding, to allow for the fact that the individual must alive at the earliest census, and have been in New Zealand at the previous censuses. For example for cohort 06019691, the individual must be at least 15 years old, and have been in New Zealand for both the 0196 and 9691 censuses. This also means that there will be no child data sets beyond the three cohort censuses, as the individual will have to be 15 or older, which means they will not meet the census definition of a child.

3.0 Results

Adults 2 census cohorts table

Adults				
Cohort	Non-biased linkages before weighting	Non-biased linkages after main effects weighting	Non-biased linkages after main and interaction effects weighting	Largest increase in non-biased linkages
0601	40.9%	57.2%	57.8%	16.9%
0196	46.5%	71.1%	71.3%	24.8%
9691	63.7%	71.7%	71.0%	8%
9186	42.8%	52.0%	53.1%	10.3%
8681	45.5%	49.8%	47.7%	4.3%

We can see that we have improvement across all five adult cohorts, ranging from about 4% to 25%. The non-biased linkages before the weighting range from 41% to 64%, and after weighting we can see they improve to about 50% to 72%. We can also see that there are occasions when the main effects weighting give better results than the main and interaction effects weighting, such as in the case of cohort 9186 and 8681.

Adults 3+ census cohorts table

Adults				
	before weighting	linkages after weighting	biased linkages	
060196	62.7%	83.8%	21.1%	Geometric mean
019691	72.1%	79.2%	7.1%	Arithmetic mean
969186	75.2%	83.0%	7.8%	Geometric mean
918681	72.0%	78.3%	6.3%	Geometric mean
06019691	72.3%	81.1%	8.8%	Arithmetic mean
01969186	74.4%	81.3%	6.9%	Geometric mean
96918681	76.0%	82.0%	6.0%	Geometric mean
0601969186	73.2%	78.2%	5.0%	Arithmetic mean
0196918681	75.8%	79.8%	4.0%	Geometric mean
060196918681	71.3%	74.2%	2.9%	Geometric mean

We can see that we have improvement across the remaining ten adult cohorts, ranging from about 3% to 9%. The non-biased linkages before the weighting range from 72% to 76%, and after weighting we can see they improve to about 78% to 83%. We can also see that although geometric mean weighting usually give a better result, there are occasions when the arithmetic mean weighting give better results, such as in the case of the cohort 019691, cohort 06019691 and cohort 0601969186.

Children 2 census cohorts table

Children				
Cohort	Non-biased linkages before weighting	Non-biased linkages after main effects weighting	Non-biased linkages after main and interaction effects weighting	Largest increase in non-biased linkages
0601	54.5%	68.0%	73.6%	19.1%
0196	62.3%	78.9%	73.3%	16.6%
9691	58.3%	57.7%	65.0%	6.7%
9186	55.6%	60.8%	56.9%	5.2%
8681	61.9%	66.7%	70.5%	8.6%

We can see that we have improvement across all five children cohorts, ranging from about 5% to 19%. The non-biased linkages before the weighting range from 55% to 62%, and after weighting we can see they improve to about 61% to 79%. We can also see that there are occasions when the main effects weighting gives better results than the main and interaction effects weighting, such as for cohort 9691.

Children 3+ census cohorts table

Children				
Cohort	Non-biased linkages before weighting	Non-biased linkages after weighting	Increase in non- biased linkages	Method Used
060196	69.1%	79.3%	10.2%	Arithmetic mean
019691	72.1%	75.6%	3.5%	Geometric mean
969186	68.3%	75.8%	7.5%	Geometric mean
918681	72.6%	72.2%	~0%	

We can see that we have improvement across the remaining four children cohorts, with the exception of cohort 918681, ranging from about 4% to 10%. The non-biased linkages before the weighting range from 68% to 73%, and after weighting we can see they improve to about 72% to 79%. We can also see that although geometric mean weighting usually give a better result, there are occasions when the arithmetic mean weighting give better results, such as in the case of the cohort 060196.

Note:

There are no results for children beyond these cohorts due to the longitudinal nature of the NZLC. To be in a four census cohort, the individual had to be at least 15 years old in the earliest census, and due to a child being defined as a 0–15 year old in the census, by definition there cannot be children beyond the 3 cohort censuses.

4.0 Discussion & Conclusions

Across cohorts, 40–76% of correlations were unbiased in unweighted analyses. Weighting increased the number of unbiased correlations by 3 to 25 percentage points, and the weighted-interaction correlations tended to be less biased than the weighted-main correlations. For adults we can see that we have improvements ranging from about 4 to 25 percentage points. For children we can see that we have improvements ranging from about 4 to 19 percentage points, with the exception of one cohort.

While we cannot eliminate bias from the census, we can significantly reduce it. The project has successfully found ways to significantly reduce bias across all cohorts, and thus has achieved its intended goal. However there are still a few things left that could potentially improve the current results. Firstly, new variables have been created that we could include in the correlation matrix to create better weights to use, reducing the bias further. The second thing that could be done is to use the weights obtained in the interaction and main effects logistic regression model to get better results in the later census cohorts.

For cohorts with 3+ Censuses, we tried a number of analysis methods, but found using the two census cohort weights we had obtained in the previous logistic regressions to estimate weights for three census and above cohorts worked very well, bypassing the need to use the logistic model for further cohorts

5.0 References

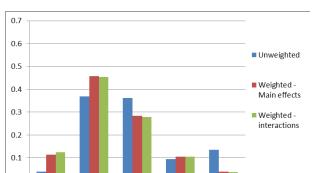
Statistics New Zealand (2013). Linking Censuses: New Zealand Longitudinal Census 1981–2006. Available from www.stats.govt.nz.

Appendices

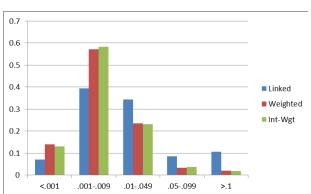
1. Graphs of proportion of correlations with different magnitudes of bias using different weighting methods (all cohorts)

Adults

0601

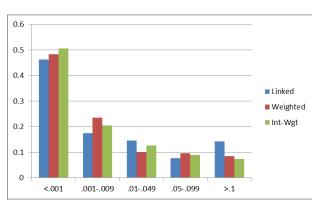


0196

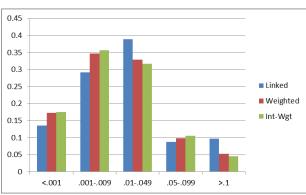


9691

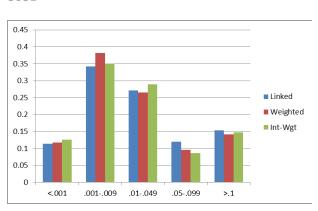
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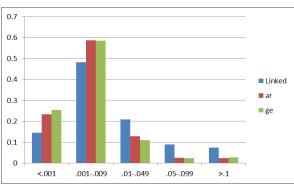


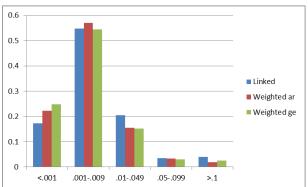
9186

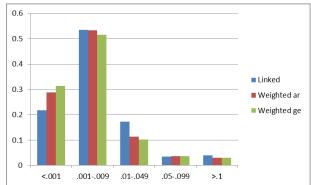


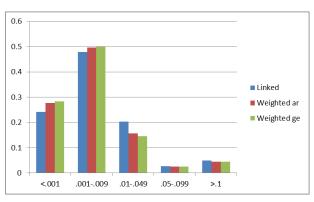
8681

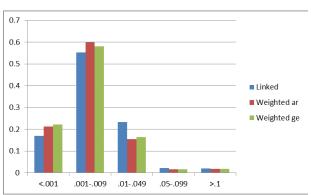


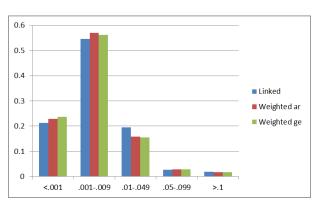


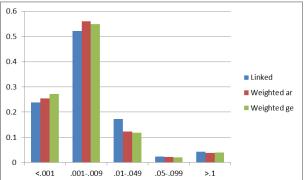


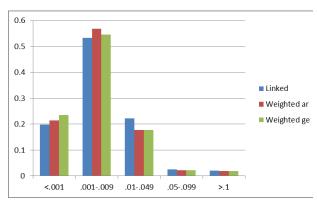


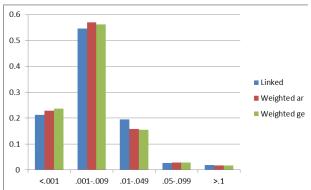


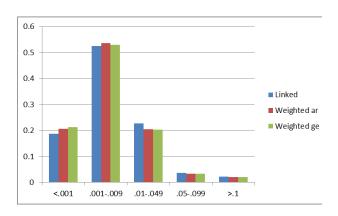




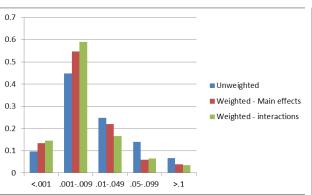


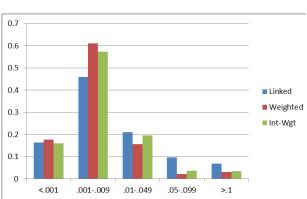


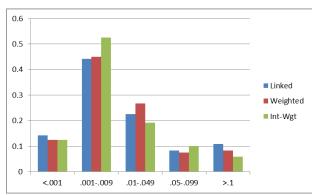


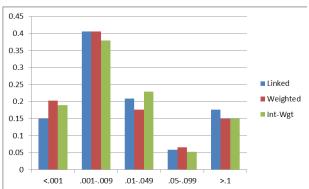


Children

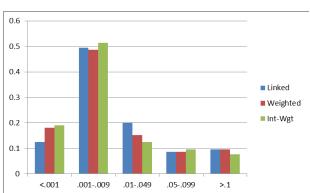


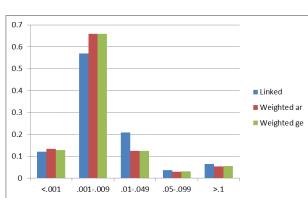


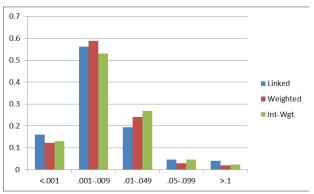


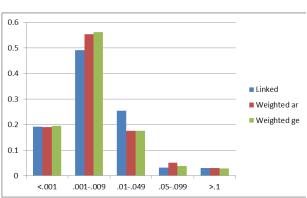


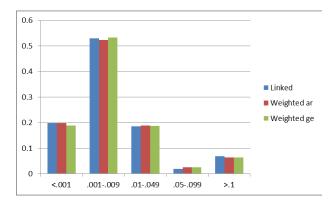
8681 060196











2. Sample SAS Code: Cohort 060196

```
libname vera '\wprdfs08\RO-MAA2013-18 Linkage Bias Longitudinal Census';
libname ver2 '\\wprdfs08\DataLab-MA\MAA2013-18 Linkage Bias Longitudinal
Census\Vera\Updated data dec 2013';
libname vernzdep '\wprdfs08\RO-MAA2013-18 Linkage Bias Longitudinal
Census\Updated data dec 2013';
libname created '\\wprdfs08\DataLab-MA\MAA2013-18 Linkage Bias Longitudinal
Census\Vera\Created data sets';
data wqt060196 (keep = ID linkind0601 linkind0196 wqt0601 wqt0196
wgt060196 armean wgt060196 gemean);
set ver2.wqtfull;
wgt060196 armean = (wgt0601+wgt0196)/2;
if \sim (linkind0601=1 and linkind0196=1) then wgt060196 armean = .;
wgt060196 gemean = (wgt0601*wgt0196)**(.5);
if \sim (linkind0601=1) and linkind0196=1) then wgt060196 gemean = .;
if linkind0601 ~=.;
run;
proc means data= wgt060196;
var wgt060196 armean wgt060196 gemean linkind0601;
run;
proc corr data= wgt060196;
var wgt060196 armean wgt060196 gemean;
run:
data aa;
set ver2.individual linkind0601 2006;
run;
data datasex (keep=ID sex);
set ver2.spine dataset;
run;
data dataeth (keep=ID eur06 06 Mao06 06 Pac06 06 Asian06 06 MELAA06 06
Other06 06 EthNS06);
set ver2.ethnicity info;
run;
data datanzdep (keep=MB06 nzdep2006);
set vernzdep.nzdep2006 mb06;
nzdep2006=nzdep2006 mb06;
if nzdep2006=. then nzdep2006=99;
run;
data datamb (keep=id mb06); *adding this new dataset to the work library;
set ver2.geogr linkspine 0601;
mb06=URSmb06 06;
run;
proc sort data=datamb;
by mb06;
run;
```

```
proc sort data=datanzdep;
by mb06;
run;
data data mb nzdep; *merging to form a dataset with ID mb06 nzdep2006;
merge datamb datanzdep;
by mb06;
run;
proc sort data=data mb nzdep;
by ID;
run;
data data2 mb nzdep; *removing those meshblocks which no IDs live in;
set data mb nzdep;
if id ~=.;
run;
proc sort data=aa;
by ID;
run;
proc sort data=datasex;
by ID;
run;
proc sort data=dataeth;
by ID;
run;
proc sort data=data2 mb nzdep;
by ID;
run;
data aa2; *merging all datasets together;
merge aa datasex dataeth data2 mb nzdep;
by ID;
run;
data aa3; *reducing dataset down to those that exist in 2006;
set aa2;
if Linkind0601~=.;
run;
data aa4;
set aa3;
age06=input(age code 06,f4.0);
if 5<=age06<=9 then age06=1;
if 10<=age06<=14 then age06=2;
if 15<=age06<=19 then age06=3;
if 20<=age06<=24 then age06=4;
if 25<=age06<=29 then age06=5;
if 30<=age06<=34 then age06=6;
if 35<=age06<=39 then age06=7;
if 40<=age06<=44 then age06=8;
if 45<=age06<=49 then age06=9;
if 50<=age06<=54 then age06=10;
```

```
if 55<=age06<=59 then age06=11;
if 60<=age06<=64 then age06=12;
if 65<=age06<=69 then age06=13;
if 70<=age06<=74 then age06=14;
if 75<=age06<=79 then age06=15;
if 80<=age06<=84 then age06=16;
if 85<=age06<=120 then age06=17;
adult06=0;
if individual rec type code 06='3' then adult06=1;
yrs at addr06=input(years at addr code 06, F4.0);
if 1 \le yrs at addr06 \le 5 then yrs at addr06 = 1;
if 6<=yrs at addr06<=10 then yrs at addr06=2;
if 11<=yrs at addr06<=20 then yrs at addr06=3;
if 21 <= yrs at addr06 <= 98 then yrs at addr06 = 4;
if yrs at addr06 in(777,999) then yrs at addr06=9;
same addr 5yrs ago06=input(addr 5years ago code 06,f4.0);
if same_addr_5yrs_ago06=2 then same_addr_5yrs_ago06=0;
if same addr 5yrs ago06 in (5,99) then same addr 5yrs ago06=9;
NZ born06=0;
if birth country code 06='1201' then NZ born06=1;
if birth country code 06='9999' then NZ born06=9;
yrs in NZO6=input(years in NZ code 06,f4.0);
if 0 \le yrs in NZ06 \le 9 then yrs in NZ06 = 1;
if 10<=yrs in NZ06<=19 then yrs in NZ06=2;
if 20<=yrs in NZ06<=97 then yrs in NZ06=3;
if yrs in NZ06=888 then yrs in NZ06=4;
if yrs in NZ06 in (777,999) then yrs in NZ06=9;
offic lang dummy=input(official language code 06,f4.0);
if offic lang dummy in (2,5) then language indicator06=1;
if offic lang dummy in (1,3,4,6) then language indicator06=2;
if offic_lang_dummy in (7,8) then language_indicator06=3;
if offic lang dummy in (97,98,99) then language indicator06=9;
Language count06=input(languages count code 06,f4.0);
if 3<=Language count06<=6 then Language count06=3;
if 7<=Language count06<=9 then Language count06=9;
maori descent06= input(recode maori descent code 06, f4.0);
if maori descent06=2 then maori descent06=0;
if maori_descent06 in (4,7,9) then maori descent06=9;
iwi ind06=input(iwi ind code 06,f4.0);
if iwi ind06=2 then iwi ind06=0;
if iwi ind06=7 then iwi ind06=9;
iwi count06=input(iwi count code 06,f4.0);
if 3<=iwi count06<=5 then iwi count06=3;
if iwi count06 in (9) then iwi count06=0;
if iwi count06 in (7,8) then iwi count06=9;
*Created the variable so that if not maori, then iwi count=0;
religious06=1;
if religion1 code 06='00000' then religious06=0;
if religion1 code 06 in ('94444','95555','97777','98888','99999')
then religious06=9;
live with parents06=0;
if living arrangement6 code 06='0411' then live with parents06=1;
live with partner06=0;
if living arrangement1 code 06='0211' then live with partner06=1;
if living arrangement2 code 06='0211' then live with partner06=1;
if living arrangement3 code 06='0212' then live with partner06=1;
if living arrangement4 code 06='0211' then live with partner06=1;
```

```
if living arrangement5 code 06='0212' then live with partner06=1;
live with siblings06=0;
if living arrangement8 code 06='0511' then live with siblings06=1;
live with children06=0;
if living arrangement7 code 06='0311' then live with children06=1;
live alone 06=0;
if living arrangement11 code 06='0111' then live alone06=1;
live with flatmates 06=0;
if living arrangement9 code 06='0611' then live with flatmates06=1;
live with other 06=0;
if living arrangement10 code 06='7777' then live with other06=1;
difficulty acty count06=0;
if difficulty actyl code 06='1' then difficulty acty count06=
difficulty acty count06+1;
if difficulty acty2 code 06='2' then difficulty acty count06=
difficulty acty count06+1;
if difficulty_acty3_code_06='3' then difficulty_acty_count06=
difficulty acty count06+1;
if difficulty acty4 code='4' then difficulty acty count06=
difficulty acty count06+1;
if difficulty acty count in (4,0) then difficulty acty count06=9;
if difficulty acty4 code='4' then difficulty acty count06=0;
disability06=0;
if dsblty code 06='1' then disability06=1;
if dsblty code 06 in ('7','9') then disability06=9;
disability ind06=input(dsblty ind code 06,f4.0);
if disability ind06=7 then disability ind06=9;
smoke06=input(smoking Status code 06, f4.0);
if smoke06 in (2,3) then smoke06=0;
if smoke06 in (7,9) then smoke06=9;
own residence06=input(tenure holder code 06,f4.0);
if own residence06=2 then own residence06=0;
if own_residence06 in (7,9) then own residence06=9;
marital status legal06=input(legal marital status code 06,f4.0);
if marital status legal06 in (2) then marital status legal06=0;
if marital status legal06 in (1,3) then marital status legal06=3;
if marital status legal06 in (6) then marital status legal06=1;
if marital_status_legal06 in (4,5) then marital status legal06=2;
if marital status legal06 in (7,9) then marital status legal06=9;
children born06=input(fertility code 06,f4.0);
if 2<=children born06<=10 then children born06=2;
if children born06 in (55,77,88,99) then children born06=9;
had children06=children born06;
if children born06=2 then had children06=1;
highest qual06=input(highest qual code 06, f4.0);
if highest qual06 in (1,2,3,4) then highest qual06=1;
if highest qual06 in (5,6,7,8,9,10) then highest qual06=2;
if highest qual06 in (11,12,13,14) then highest qual06=3;
if highest qual06 in (97,99) then highest qual06=9;
income source count06=input(income srce count code 06, f4.0);
if 3<=income source count06<=10 then income source count06=3;
if income source count06=99 then income source count06=9;
benefit income06=0;
if income srce7 code 06='07' then benefit income06=1;
if income srce8 code 06='08' then benefit income06=1;
if income srce9 code 06='09' then benefit income06=1;
if income srce10 code 06='10' then benefit income06=1;
```

```
if income srcell code 06='11' then benefit income06=1;
if income srce12 code 06='12' then benefit income06=1;
if adult06=0 then benefit income06=.;
ttl personal income06=input(total income code 06,f4.0);
if ttl personal income06 in (1,2) then ttl personal income06=0;
if 3<=ttl personal income06<=8 then ttl personal income06=1;
if 9<=ttl personal income06<=14 then ttl_personal_income06=2;</pre>
if ttl personal income06=99 then ttl personal income06=9;
income support06=input(income support count code 06,f4.0);
if 1<=income support06<=6 then income support06=1;
hrs work mainjob06=input(work hrs1 code 06,f4.0);
if 1<=hrs work mainjob06<=29 then hrs work mainjob06=1;
if 30<=hrs work mainjob06<=49 then hrs work mainjob06=2;
if 50<=hrs work mainjob06<=168 then hrs work mainjob06=3;
if hrs_work_mainjob06 in (777) then hrs_work_mainjob06=9;
if hrs work mainjob06=999 then hrs work mainjob06=0;
if wklfs_code_06='3' then work_labour_force_status06=0;
if wklfs code 06='4' then work labour force status06=1;
if wklfs code 06='1' then work labour force status06=2;
if wklfs code 06='2' then work labour force status06=3;
if wklfs code 06='9' then work labour force status06=9;
travel work06=input(travel work code 06,f4.0);
if travel work06 in (1,2) then travel work06=0;
if travel work06 in (3,4,5,8) then travel work06=1;
if travel work06 in (6,7) then travel work06=2;
if travel work06 in (9,10) then travel work06=3;
if travel work06 in (15,77,99) then travel work06=9;
unpaid acty count06=0;
if unpaid actyl code 06='01' then unpaid acty count06=unpaid acty count06+1;
if unpaid acty2 code 06='02' then unpaid acty count06=unpaid acty count06+1;
if unpaid_acty3_code_06='03' then unpaid_acty_count06=unpaid_acty_count06+1;
if unpaid acty4 code 06='04' then unpaid acty count06=unpaid acty count06+1;
if unpaid acty5 code 06='05' then unpaid acty count06=unpaid acty count06+1;
if unpaid acty6 code 06='06' then unpaid acty count06=unpaid acty count06+1;
if unpaid acty count06=0 then unpaid acty count06=9;
if unpaid acty7 code 06='00' then unpaid acty count06=0;
if adult06=0 then unpaid acty count06=.;
if unpaid acty count06 in (3,4,5,6) then unpaid acty count06=3;
sex female06=0;
if sex='2' then sex female06=1;
Eur06=input (Eur06 06, f4.0);
if Eur06=. then Eur06=0;
Mao06=input (Mao06 06, f4.0);
if Mao06=. then mao06=0;
Pac06=input(Pac06 06, f4.0);
if Pac06=. then Pac06=0;
Asian06=input(Asian06 06,f4.0);
if Asian06=. then Asian06=0;
MELAA06=input(MELAA06 06,f4.0);
if MELAA06=. then MELAA06=0;
Other06=input(Other06 06,f4.0);
if Other06=. then Other06=0;
EthNS2006=input (ethNS06, f4.0);
if EthNS2006=. then EthNS2006=0;
if 100000 < \text{occupation} 2006 \text{ code } 06 < 200000 \text{ then } oc06 = 1;
if 200000 < occupation2006 code 06 < 300000 then oc06 = 2;
if 300000 < occupation2006 code 06 < 400000 then oc06 = 3;
```

```
if 400000 < occupation2006 code 06 < 500000 then oc06 = 4;
if 500000 < occupation2006 code 06 < 600000 then oc06 = 5;
if 600000 < \text{occupation} 2006 \text{ code } 06 < 700000 \text{ then } 0c06 = 6;
if 700000 < occupation2006 code 06 < 800000 then oc06 = 7;
if 800000 < occupation2006 code 06 < 900000 then oc06 = 8;
if 900000 < \text{occupation} 2006 \text{ code } 06 < 1000000 \text{ then } 006 = 9;
proc freq data=aa4;
table unpaid acty1 code 06 unpaid acty2 code 06 unpaid acty3 code 06
unpaid acty4 code 06 unpaid acty5 code 06 unpaid acty6 code 06
unpaid acty7 code 06 unpaid acty count06;
run;
proc contents data=aa3;
run;
*reducing to just those variables constructed plus age and yearsinnz;
data aa5 (keep= ID linkind0601 age06 adult06 yrs at addr06
same addr 5yrs ago06 NZ born06 yrs in NZ06 language indicator06
Language count06 maori descent06 iwi ind06 iwi count06 religious06
live with parents06 live with partner06 live with siblings06
live with children06 live alone06 live with flatmates06 live with other06
difficulty acty count06 disability06 disability ind06 smoke06 own residence06
marital status legal06 children born06 had children06 highest qual06
income source count06 benefit income06 ttl personal income06 income support06
hrs work mainjob06 work labour force status06 travel work06
unpaid acty count06 sex female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06
EthNS2006 nzdep2006 oc06 age code 06 years in NZ code 06);
set aa4;
run;
proc freq data=aa5;
tables unpaid acty count06;
run;
/* 2001*/
data a;
set ver2.individual linkind0196 2001;
data datasex (keep=ID sex);
set ver2.spine dataset;
run;
data dataeth (keep=ID eur06 01 Mao06 01 Pac06 01 Asian06 01 MELAA06 01
Other06 01 EthNS01);
set ver2.ethnicity info;
run;
data datanzdep (keep= MB06 nzdep2001);
set vernzdep.nzdep2001 mb01 mb06;
nzdep2001=nzdep2001 mb01;
if nzdep2001=. then nzdep2001=99;
run;
```

```
data datamb (keep=id mb06);*creating new data set in work library;
set ver2.geogr linkspine 0196;
mb06=URSmb06 01;
run;
proc sort data=datamb;
by mb06;
run;
proc sort data=datanzdep;
by mb06;
run;
data data_mb_nzdep; *merging to form a dataset with ID mb06 nzdep2001;
merge datamb datanzdep;
by mb06;
run;
proc sort data=data mb nzdep;
by id;
run;
data data2 mb nzdep; *removing those meshblocks which no IDs live in;
set data mb nzdep;
if id ~=.;
run;
proc sort data=data2 mb nzdep;
by nzdep2001;
run;
data data3_mb_nzdep;
set data2 mb nzdep;
if nzdep2001=. then nzdep2001=99; *recoding IDs with no identified nzdep as 99;
run;
proc sort data=a;
by ID;
run;
proc sort data=datasex;
by ID;
run;
proc sort data=dataeth;
by ID;
run;
proc sort data=data3 mb nzdep;
by ID;
run;
data a2;
merge a datasex dataeth data3 mb nzdep;
by ID;
run;
```

```
data a3; *reducing data set to those IDs only eligible to be linked 0196;
set a2;
if linkind0196~=.;
run;
data a4;
set a3;
adult01=0;
if individual rec type code 01='3' then adult01=1;
yrs at addr01=input(years at addr code 01, F4.0);
if 1<=yrs at addr01<=5 then yrs at addr01=1;</pre>
if 6<=yrs at addr01<=10 then yrs at addr01=2;</pre>
if 11<=yrs at addr01<=20 then yrs at addr01=3;
if 21<=yrs at addr01<=98 then yrs at addr01=4;
if yrs at addr01 in(777,999) then yrs at addr01=9;
same addr 5yrs ago01=input(addr 5years ago code 01,f4.0);
if same_addr_5yrs_ago01=2 then same_addr_5yrs_ago01=0;
if same addr 5yrs ago01=5 then same addr 5yrs ago01=9;
age01=input(age code 01,f4.0);
if 5<=age01<=9 then age01=1;
if 10<=age01<=14 then age01=2;
if 15<=age01<=19 then age01=3;
if 20<=age01<=24 then age01=4;
if 25<=age01<=29 then age01=5;
if 30<=age01<=34 then age01=6;
if 35<=age01<=39 then age01=7;
if 40<=age01<=44 then age01=8;
if 45<=age01<=49 then age01=9;
if 50<=age01<=54 then age01=10;
if 55<=age01<=59 then age01=11;
if 60<=age01<=64 then age01=12;
if 65<=age01<=69 then age01=13;
if 70<=age01<=74 then age01=14;
if 75<=age01<=79 then age01=15;
if 80<=age01<=84 then age01=16;
if 85<=age01<=120 then age01=17;
NZ born01=0;
if birth country code 01='1201' then NZ born01=1;
if birth country code 01='9999' then NZ born01=9;
yrs in NZ01=input(years in NZ code 01, f4.0);
if 0 \le yrs in NZ01\le 9 then yrs in NZ01=1;
if 10<=yrs in NZ01<=19 then yrs in NZ01=2;
if 20<=yrs in NZ01<=97 then yrs in NZ01=3;
if yrs_in_NZ01=999 then yrs_in NZ01=4; *lived here forever (i.e. not stated);
if yrs in NZ01=777 then yrs in NZ01=9;
offic lang dummy=input(official language code 01,f4.0);
if offic lang dummy in (2,5) then language indicator01=1;
if offic lang dummy in (1,3,4,6) then language indicator01=2;
if offic lang dummy in (7,8) then language indicator01=3;
if offic lang dummy in (97,98,99) then language indicator01=9;
Language count01=input(languages count code 01,f4.0);
if 3<=Language count01<=6 then Language count01=3;</pre>
if 7<=Language count01<=9 then Language count01=9;</pre>
religious01=1;
if religion1 code 01='00000' then religious01=0;
if religion1 code 01 in ('94444','95555','97777','98888','99999')
then religious01=9;
```

```
difficulty acty count01=0;
if difficulty actyl code 01='1' then difficulty acty count01=
difficulty acty count01+1;
if difficulty_acty2_code 01='2' then difficulty acty count01=
difficulty acty count01+1;
if difficulty acty3 code 01='3' then difficulty acty count01=
difficulty acty count01+1;
if difficulty acty4 code 01='4' then difficulty acty count01=
difficulty acty count01+1;
if difficulty acty count01 in (4,0) then difficulty acty count01=9;
if difficulty acty4 code 01='4' then difficulty acty count01=0;
disability01=0;
if dsblty code 01='1' then disability01=1;
if dsblty code 01 in ('7','9') then disability01=9;
disability ind01=input(dsblty ind code 01,f4.0);
maori descent01= input(maori descent code 01, f4.0);
if maori_descent01=2 then maori_descent01=0;
if maori descent01 in (3,4,5,6,7,9) then maori descent01=9;
iwi ind01=input(iwi ind code 01,f4.0);
if iwi ind01=2 then iwi ind01=0;
if iwi ind01=7 then iwi ind01=9;
iwi count01=input(iwi count code 01,f4.0);
if 3<=iwi count01<=5 then iwi count01=3;
if iwi count01 in (9) then iwi count01=0;
if iwi count01 in (7,8) then iwi count01=9;
live with partner01=0;
if living arrangement1 code 01='0211' then live with partner01=1;
if living arrangement2 code 01='0211' then live with partner01=1;
live with children01=0;
if living arrangement3 code 01='0311' then live with children01=1;
live with parents01=0;
if living arrangement4 code 01='0411' then live with parents01=1;
live with siblings01=0;
if living arrangement5 code 01='0511' then live with siblings01=1;
live with flatmates01=0;
if living arrangement6 code 01='0611' then live with flatmates01=1;
live with other 01=0;
if living arrangement7 code 01='7777' then live with other01=1;
live alone 01=0;
if living arrangement8 code 01='0111' then live alone01=1;
marital_status_legal01=input(legal marital status code 01,f4.0);
if marital status legal01 in (21) then marital status legal01=0;
if marital status legal01 in (33) then marital status legal01=1;
if marital_status_legal01 in (31,32) then marital_status_legal01=2;
if marital status legal01 in (11) then marital status legal01=3;
if marital status legal01 in (77,99) then marital status legal01=9;
currently married=0;
if adult01=0 then currently married=.;
if legal marital status code 01='21' then currently married=1;
if legal marital status code 01 in ('77','99') then currently married=9;
currently separated=0;
if adult01=0 then currently separated=.;
if legal marital status code 01 in ('31','32') then currently separated=1;
if legal marital status code 01 in ('77','99') then currently separated=9;
never married=0;
if adult01=0 then never married=.;
if legal marital status code 01 in ('11') then never married=1;
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```
if legal marital status code 01 in ('77','99') then never married=9;
income source count01=input(income srce count code 01, f4.0);
if 3<=income source count01<=10 then income source count01=3;
if income source count01=99 then income source count01=9;
income support01=input(income support count code 01,f4.0);
if 1<=income support01<=6 then income support01=1;</pre>
benefit income01=0;
if income srce7 individual code 01='07' then benefit income01=1;
if income srce8 individual code 01='08' then benefit income01=1;
if income_srce9_individual_code_01='09' then benefit_income01=1;
if income srce10 individual code 01='10' then benefit income01=1;
if income_srce11_individual_code_01='11' then benefit income01=1;
if income srce12 individual code 01='12' then benefit income01=1;
if adult01=0 then benefit income01=.;
ttl personal income01=input(total income individual code 01,f4.0);
if ttl personal income01 in (1,2) then ttl personal income01=0;
if 3<=ttl_personal_income01<=6 then ttl_personal_income01=1;</pre>
if 6<=ttl personal income01<=13 then ttl personal income01=2;
if ttl personal income01=99 then ttl personal income01=9;
own residence01=input(tenure holder code 01, f4.0);
if own residence01=2 then own residence01=0; if own residence01 in (7,9)
then own residence01=9;
highest qual01=input(highest qual code 01, f4.0);
if highest qual01 in (1,2,3,4,5) then highest qual01=1;
if highest qual01 in (6,7,8,9) then highest qual01=2;
if highest qual01 in (10,11) then highest qual01=3;
if highest qual01 in (97,99) then highest qual01=9;
if wklfs code 01='3' then work labour force status01=0;
if wklfs code 01='4' then work labour force status01=1;
if wklfs code 01='1' then work labour force status01=2;
if wklfs_code_01='2' then work_labour_force_status01=3;
if wklfs code 01='9' then work labour force status01=9;
work at home01=input(workplace addr ind code 01,f4.0);
if work at home01=2 then work at home01=0;
hrs work mainjob01=input(work hrs1 code 01,f4.0);
if 1<=hrs work mainjob01<=29 then hrs work mainjob01=1;
if 30<=hrs work mainjob01<=49 then hrs work mainjob01=2;
if 50<=hrs work mainjob01<=168 then hrs work mainjob01=3;</pre>
if hrs work mainjob01 in (777,888) then hrs work mainjob01=9;
if hrs work mainjob01=999 then hrs work mainjob01=0;
travel work01=input(travel work code 01,f4.0);
if travel work01 in (1,2) then travel work01=0;
if travel work01 in (3,4,5,8) then travel work01=1;
if travel work01 in (6,7) then travel work01=2;
if travel work01 in (9,10) then travel work01=3;
if travel work01 in (15,99) then travel work01=9;
unpaid acty count01=input(unpaid acty count code 01,f4.0);
if unpaid acty count01 in (3,4,5,6,7,8) then unpaid acty count01=3;
if unpaid acty count01=99 then unpaid acty count01=9;
sex female01=0;
if sex='2' then sex female01=1;
Eur01=input(Eur06 01, f4.0);
if Eur01=. then Eur01=0;
Mao01=input (Mao06 01, f4.0);
if Mao01=. then mao01=0;
Pac01=input(Pac06 01, f4.0);
if Pac01=. then Pac01=0;
```

```
Asian01=input(Asian06 01,f4.0);
if Asian01=. then Asian01=0;
MELAA01=input (MELAA06 01, f4.0);
if MELAA01=. then MELAA01=0;
Other01=input (Other06 01, f4.0);
if Other01=. then Other01=0;
EthNS2001=input (ethNS01, f4.0);
if EthNS2001=. then EthNS2001=0;
if 10000 < occupation99 code 01 < 20000 then oc01 = 1;
if 20000 < occupation99\_code\_01 < 30000 then oc01 = 2;
if 30000 < occupation99 code 01 < 40000 then oc01 = 3;
if 40000 < occupation99 code 01 < 50000 then oc01 = 4;
if 50000 < \text{occupation} 99 \text{ code } 01 < 60000 \text{ then } \text{oc} 01 = 5;
if 60000 < occupation99 code 01 < 70000 then oc01 = 6;
if 70000 < occupation99 code 01 < 80000 then oc01 = 7;
if 80000 < occupation99 code 01 < 90000 then oc01 = 8;
if 90000 < occupation99_code_01 < 92000 then oc01 = 9;
if 92000 < occupation99 code 01 < 100000 then oc01 = 99;
run;
data a5 (keep= ID linkind0196 age01 adult01 yrs at addr01
same addr 5yrs ago01 NZ born01 yrs in NZ01 language indicator01
Language count01 maori descent01 iwi ind01 iwi count01 religious01
live with parents01 live with partner01 live with siblings01
live with children01 live alone01 live with flatmates01 live with other01
difficulty acty count01 disability01 disability ind01 own residence01
marital status legal01 highest qual01 income source count01 benefit income01
ttl personal income01 income support01 hrs work mainjob01
work labour force status01 travel work01 unpaid acty count01 sex female01
eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01
age code 01 years in NZ code 01);
set a4;
run;
proc sort data=aa5;
by ID;
run;
proc sort data=a5;
by ID;
run;
data a;
merge aa5 a5;
by ID;
run:
data b;
set a;
if linkind0601 ne .;
if age06>=2;
if (yrs in NZ06~=1 | linkind0196~=.);
run:
proc sort data=b;
by ID;
run;
```

```
proc sort data=wgt060196;
by ID;
run;
data mergedwgt060196;
merge b wgt060196;
by ID;
run;
data bb;
set mergedwgt060196;
if age06 ne "";
linkind060196=0;
if (linkind0601=1 and linkind0196=1) then linkind060196=1;
run;
proc means data=bb;
var linkind060196 wgt060196 armean wgt060196 gemean;
run;
*previously done with **1.85;
data cc;
set bb;
wgt060196 armean scaled = wgt060196 armean+.4697;
wgt060196 gemean scaled = wgt060196 gemean+.4817;
if wgt060196 armean scaled>20 then wgt060196 armean scaled = 20;
if wgt060196 gemean scaled>20 then wgt060196 gemean scaled = 20;
run;
proc means data=cc;
var linkind060196 wgt060196 armean wgt060196 gemean wgt060196 armean scaled
wgt060196 gemean scaled;
run;
data adultcc;
set cc;
if adult06=1;
data childcc (keep= ID linkind0601 linkind060196 wgt060196 armean
wgt060196 gemean age06 adult06 yrs at addr06 same addr 5yrs ago06 NZ born06
yrs in NZ06 language indicator06 Language count06 maori descent06 iwi ind06
iwi count06 religious06 live with parents06 live with partner06
live with siblings06 live with children06 live alone06 live with flatmates06
live_with_other06 difficulty_acty_count06 disability06 disability ind06
sex female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006
linkind0196 age01 yrs at addr01 same addr 5yrs ago01 NZ born01 yrs in NZ01
language indicator01 Language count01 maori descent01 iwi ind01 iwi count01
religious01 live with parents01 live with partner01 live with siblings01
live with children01 live alone01 live with flatmates01 live with other01
difficulty acty count01 disability01 disability ind01 sex female01 eur01
Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001);
set cc;
if adult06=0;
run;
```

```
data adultdd;
set adultcc;
r=ranuni (1018);
test=0;
if r>.7 then test=1;
run:
data childdd;
set childcc; r=ranuni(1810);test=0;
if r>.7 then test=1;
run;
proc freq data = adultdd;
table test linkind060196 test*linkind060196;
run;
proc freq data = childdd;
table test linkind060196 test*linkind060196;
run:
proc corr data=adultdd (where=(test=1)) noprob;
var age06 yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06
language indicator06 Language count06 maori descent06 iwi ind06 iwi count06
religious06 live with parents06 live with partner06 live with siblings06
live with children06 live alone06 live with flatmates06 live with other06
difficulty acty count06 disability06 disability ind06 smoke06 own residence06
marital status legal06 children born06 had children06 highest qual06
income source count06 benefit_income06 ttl_personal_income06 income_support06
hrs work mainjob06 work labour force status06 travel work06
unpaid acty count06 sex female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06
EthNS2006 nzdep2006 oc06 age01 yrs_at_addr01 same_addr_5yrs_ago01 NZ_born01
yrs in NZ01 language indicator01 Language count01 maori descent01 iwi ind01
iwi count01 religious01 live with parents01 live with partner01
live with siblings01 live with children01 live alone01 live with flatmates01
live with other01 difficulty acty count01 disability01 disability ind01
own residence01 marital status legal01 highest qual01 income source count01
benefit income01 ttl personal income01 income support01 hrs work mainjob01
work labour force status01 travel work01 unpaid acty count01 sex female01
eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01;
proc corr data=adultdd (where=(test=1 & linkind060196=1)) noprob;
var age06 yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06
language indicator06 Language count06 maori descent06 iwi ind06 iwi count06
religious06 live with parents06 live with partner06 live with siblings06
live with children06 live alone06 live with flatmates06 live with other06
difficulty acty count06 disability06 disability ind06 smoke06 own residence06
marital status legal06 children born06 had children06 highest qual06
income source count06 benefit income06 ttl personal income06 income support06
hrs work mainjob06 work labour force status06 travel work06
unpaid acty count06 sex female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06
EthNS2006 nzdep2006 oc06 age01 yrs at addr01 same addr 5yrs ago01 NZ born01
yrs in NZ01 language indicator01 Language count01 maori descent01 iwi ind01
iwi count01 religious01 live with parents01 live with partner01
live with siblings01 live with children01 live alone01 live with flatmates01
```

live_with_other01 difficulty_acty_count01 disability01 disability_ind01
own residence01 marital status legal01 highest qual01 income source count01

benefit_income01 ttl_personal_income01 income_support01 hrs_work_mainjob01
work_labour_force_status01 travel_work01 unpaid_acty_count01 sex_female01
eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01;
run;

proc corr data=adultdd (where=(test=1 & linkind060196=1)) noprob;
weight wgt060196 armean;

var age06 yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06 language indicator06 Language count06 maori descent06 iwi ind06 iwi count06 religious06 live with parents06 live with partner06 live with siblings06 live with children06 live alone06 live with flatmates06 live with other06 difficulty acty count06 disability06 disability ind06 smoke06 own residence06 marital status legal06 children born06 had children06 highest qual06 income source count06 benefit income06 ttl personal income06 income support06 hrs work mainjob06 work labour force status06 travel work06 unpaid_acty_count06 sex_female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 oc06 age01 yrs_at_addr01 same_addr_5yrs_ago01 NZ_born01 yrs in NZ01 language indicator01 Language count01 maori descent01 iwi ind01 iwi count01 religious01 live with parents01 live with partner01 live with siblings01 live with children01 live alone01 live with flatmates01 live with other01 difficulty acty count01 disability01 disability ind01 own residence01 marital status legal01 highest qual01 income source count01 benefit income01 ttl personal income01 income support01 hrs work mainjob01 work labour force status01 travel work01 unpaid acty count01 sex female01 eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01; run;

proc corr data=adultdd (where=(test=1 & linkind060196=1)) noprob;
weight wgt060196 gemean;

var age06 yrs at addr06 same addr 5yrs age06 NZ born06 yrs in NZ06 language indicator06 Language count06 maori descent06 iwi ind06 iwi count06 religious06 live with parents06 live with partner06 live with siblings06 live with children06 live alone06 live with flatmates06 live with other06 difficulty acty count06 disability06 disability ind06 smoke06 own residence06 marital status legal06 children born06 had children06 highest qual06 income source count06 benefit income06 ttl personal income06 income support06 hrs work mainjob06 work labour force status06 travel work06 unpaid acty count06 sex female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 oc06 age01 yrs at addr01 same addr 5yrs ago01 NZ born01 yrs in NZ01 language indicator01 Language count01 maori descent01 iwi ind01 iwi count01 religious01 live with parents01 live with partner01 live with siblings01 live with children01 live alone01 live with flatmates01 live_with_other01 difficulty acty count01 disability01 disability ind01 own_residence01 marital_status_legal01 highest_qual01 income_source_count01 benefit income01 ttl personal income01 income support01 hrs work mainjob01 work labour force status01 travel work01 unpaid acty count01 sex female01 eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01; run;

proc corr data=adultdd (where=(test=1 & linkind060196=1)) noprob;
weight wgt060196_armean_scaled;
var age06 yrs_at_addr06 same_addr_5yrs_age06 NZ_born06 yrs_in_NZ06
language_indicator06 Language_count06 maori_descent06 iwi_ind06 iwi_count06
religious06 live_with_parents06 live_with_partner06 live_with_siblings06
live_with_children06 live_alone06 live_with_flatmates06 live_with_other06
difficulty_acty_count06 disability06 disability_ind06 smoke06 own_residence06
marital_status_legal06 children_born06 had children06 highest qual06

income_source_count06 benefit_income06 ttl_personal_income06 income_support06
hrs_work_mainjob06 work_labour_force_status06 travel_work06
unpaid_acty_count06 sex_female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06
EthNS2006 nzdep2006 oc06 age01 yrs_at_addr01 same_addr_5yrs_ago01 NZ_born01
yrs_in_NZ01 language_indicator01 Language_count01 maori_descent01 iwi_ind01
iwi_count01 religious01 live_with_parents01 live_with_partner01
live_with_siblings01 live_with_children01 live_alone01 live_with_flatmates01
live_with_other01 difficulty_acty_count01 disability01 disability_ind01
own_residence01 marital_status_legal01 highest_qual01 income_source_count01
benefit_income01 ttl_personal_income01 income_support01 hrs_work_mainjob01
work_labour_force_status01 travel_work01 unpaid_acty_count01 sex_female01
eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01;
run;

proc corr data=adultdd (where=(test=1 & linkind060196=1)) noprob; weight wgt060196 gemean scaled; var age06 yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06 language indicator06 Language count06 maori descent06 iwi ind06 iwi count06 religious06 live with parents06 live with partner06 live with siblings06 live with children06 live alone06 live with flatmates06 live with other06 difficulty acty count06 disability06 disability ind06 smoke06 own residence06 marital status legal06 children born06 had children06 highest qual06 income source count06 benefit income06 ttl personal income06 income support06 hrs_work_mainjob06 work_labour_force_status06 travel_work06 unpaid acty count06 sex female06 eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 oc06 age01 yrs at addr01 same addr 5yrs ago01 NZ born01 yrs in NZ01 language indicator01 Language count01 maori descent01 iwi ind01 iwi count01 religious01 live with parents01 live with partner01 live with siblings01 live with children01 live alone01 live with flatmates01 live_with_other01 difficulty_acty_count01 disability01 disability ind01 own_residence01 marital_status_legal01 highest_qual01 income_source_count01 benefit income01 ttl personal income01 income support01 hrs work mainjob01 work labour force status01 travel work01 unpaid acty count01 sex female01 eur01 Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001 oc01; run;

data ver2.wgt060196 (keep= ID linkind0601 linkind0196 linkind060196
wgt060196_armean wgt060196_gemean wgt060196_armean_scaled
wgt060196_gemean_scaled);
set cc;
run;

proc corr data=childdd (where=(test=1)) noprob;
var yrs_at_addr06 same_addr_5yrs_ago06 NZ_born06 yrs_in_NZ06
language_indicator06 Language_count06 maori_descent06 iwi_ind06 iwi_count06
religious06 live_with_parents06 live_with_partner06 live_with_siblings06
live_with_children06 live_alone06 live_with_flatmates06 live_with_other06
difficulty_acty_count06 disability06 disability_ind06 sex_female06 eur06
Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 yrs_at_addr01
same_addr_5yrs_ago01 NZ_born01 yrs_in_NZ01 language_indicator01
Language_count01 maori_descent01 iwi_ind01 iwi_count01 religious01
live_with_parents01 live_with_partner01 live_with_siblings01
live_with_children01 live_alone01 live_with_flatmates01 live_with_other01
difficulty_acty_count01 disability01 disability_ind01 sex_female01 eur01
Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001;
run;

```
proc corr data=childdd (where=(test=1 & linkind060196=1)) noprob;
var yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06
language indicator06 Language count06 maori descent06 iwi ind06 iwi count06
religious06 live with parents06 live with partner06 live with siblings06
live with children06 live alone06 live with flatmates06 live with other06
difficulty acty count06 disability06 disability ind06 sex female06 eur06
Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 yrs at addr01
same addr 5yrs ago01 NZ born01 yrs in NZ01 language indicator01
Language count01 maori descent01 iwi ind01 iwi count01 religious01
live with parents01 live with partner01 live with siblings01
live with children01 live alone01 live with flatmates01 live with other01
difficulty acty count01 disability01 disability ind01 sex female01 eur01
Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001;
run;
proc corr data=childdd (where=(test=1 & linkind060196=1)) noprob;
weight wgt060196 armean;
var yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06
language indicator06 Language count06 maori descent06 iwi ind06 iwi count06
religious06 live with parents06 live with partner06 live with siblings06
live with children06 live alone06 live with flatmates06 live with other06
difficulty acty count06 disability06 disability ind06 sex female06 eur06
Mao06 Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 yrs at addr01
same addr 5yrs ago01 NZ born01 yrs in NZ01 language indicator01
Language count01 maori descent01 iwi ind01 iwi count01 religious01
live with parents01 live with partner01 live with siblings01
live with children01 live alone01 live with flatmates01 live with other01
difficulty acty count01 disability01 disability ind01 sex female01 eur01
Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001;
run:
proc corr data=childdd (where=(test=1 & linkind060196=1)) noprob;
weight wgt060196 gemean;
var yrs at addr06 same addr 5yrs ago06 NZ born06 yrs in NZ06
language indicator06 Language count06 maori descent06 iwi ind06 iwi count06
religious06 live with parents06 live with partner06 live with siblings06
live with children06 live alone06 live with flatmates06 live with other06
difficulty acty count0 disability06 disability ind06 sex female06 eur06 Mao06
Pac06 Asian06 MELAA06 Other06 EthNS2006 nzdep2006 yrs at addr01
same addr 5yrs ago01 NZ born01 yrs in NZ01 language indicator01
Language count01 maori descent01 iwi ind01 iwi count01 religious01
live with parents01 live with partner01 live with siblings01
live with children01 live alone01 live with flatmates01 live with other01
difficulty acty count01 disability01 disability ind01 sex female01 eur01
Mao01 Pac01 Asian01 MELAA01 Other01 EthNS2001 nzdep2001;
run:
*adults 0601 interactions;
proc surveyselect data= adult3b out=adult10000 n=14500 seed=919191;
run;
data adult10000;
set adult10000;
if test=0;
run;
```

proc logistic data= adult10000;

class age yrs at addr same addr 5yrs ago NZ born yrs in NZ language indicator Language count maori descent iwi_ind iwi_count religious live_with_parents live with partner live with siblings live with children live alone live with flatmates live with other difficulty_acty_count disability disability ind smoke own residence marital status legal children born had children highest qual income source count benefit income total income income support hrs work mainjob work labour force status travel work UNPAID ACTY COUNTO6 sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS nzdep2006 oc06 /ref=first; model linkind0601 (event='1') = age yrs at addr same addr 5yrs ago NZ born yrs in NZ language indicator Language count maori descent iwi ind iwi count religious live with parents live with partner live with siblings live with children live alone live with flatmates live with other difficulty acty count disability disability ind smoke own residence marital status legal children born had children highest qual income_source_count benefit_income total_income income_support hrs work mainjob work labour force status travel work UNPAID ACTY COUNTO6 sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS nzdep2006 oc06 /selection=stepwise slentry=.1 slstay=.05 hierarchy=single;

proc logistic data= adult3b;

class age yrs_at_addr same_addr_5yrs_ago NZ_born yrs_in_NZ language_indicator Language count maori descent iwi ind iwi count religious live with parents live with partner live with siblings live with children live alone live with flatmates live with other difficulty acty count disability disability ind smoke own residence marital status legal children born had children highest qual income source count benefit income total income income support hrs work mainjob work labour force status travel work UNPAID ACTY COUNTO6 sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS nzdep2006 oc06 /ref=first; model link0601 (event='1') = age yrs at addr same addr 5yrs ago NZ born yrs in NZ language indicator Language count maori descent iwi ind iwi count religious live with parents live with partner live with siblings live with children live alone live with flatmates live with other difficulty acty count disability disability ind smoke own residence marital status legal children born had children highest qual income source count benefit income total income income support hrs work mainjob work labour force status travel work UNPAID ACTY COUNTO6 sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS nzdep2006 oc06 age*yrs at addr age*same addr 5yrs ago age*NZ born age*yrs in NZ age*language indicator age*live with parents age*live with children age*smoke age*own_residence age*marital_status_legal age*highest_qual age*income source count age*benefit_income age*UNPAID_ACTY_COUNT06 age*sex female age*eur06 age*Mao06 age*Pac06 yrs at addr*same addr 5yrs ago yrs at addr*NZ born yrs at addr*yrs in NZ yrs at addr*language indicator yrs at addr*live with parents yrs at addr*live with children yrs at addr*smoke yrs at addr*own residence yrs at addr*marital status legal yrs at addr*highest qual yrs at addr*income source count yrs at addr*benefit income yrs at addr*UNPAID ACTY COUNT06 yrs at addr*sex female yrs at addr*eur06 yrs at addr*Mao06 yrs at addr*Pac06 same addr 5yrs ago*NZ born same addr 5yrs ago*yrs in NZ same addr 5yrs ago*language indicator same addr 5yrs ago*live with parent same addr 5yrs ago*live with children same addr 5yrs ago*smoke same addr 5yrs ago*own residence same addr 5yrs ago*marital status legal same addr 5yrs ago*highest qual same addr 5yrs ago*income source count

```
same addr 5yrs ago*benefit income same addr 5yrs ago*UNPAID ACTY COUNT06
same addr 5yrs ago*sex female same addr 5yrs ago*eur06
same addr 5yrs ago*Mao06 same addr 5yrs ago*Pac06 NZ born*yrs in NZ
NZ born*language indicator NZ born*live_with_parents
NZ born*live with children NZ born*smoke NZ born*own residence
NZ born*marital status legal NZ born*highest qual NZ born*income source count
NZ born*benefit income NZ born*UNPAID ACTY COUNT06 NZ born*sex female
NZ born*eur06 NZ born*Mao06 NZ born*Pac06 yrs in NZ*language indicator
yrs in NZ*live with parents yrs in NZ*live with children yrs in NZ*smoke
yrs in NZ*own residence yrs in NZ*marital status legal yrs in NZ*highest qual
yrs in NZ*income source count yrs in NZ*benefit income
yrs in NZ*UNPAID ACTY COUNT06 yrs_in_NZ*sex_female yrs_in_NZ*eur06
yrs in NZ*Mao06 yrs in NZ*Pac06 language indicator*live with parents
language indicator*live with children language indicator*smoke
language indicator * own residence language indicator * marital status legal
language_indicator*highest_qual language_indicator*income_source_count
language_indicator*benefit_income language_indicator*UNPAID_ACTY_COUNT06
language indicator*sex female language indicator*eur06
language indicator*Mao06 language indicator*Pac06
live with parents*live with children live with parents*smoke
live with parents*own residence live with parents*marital status legal
live with parents*highest qual live with parents*income source count
live with parents*benefit income live with parents*UNPAID ACTY COUNT06
live with parents*sex female live with parents*eur06 live with parents*Mao06
live with parents*Pac06 live with children*smoke
live with children*own residence live with children*marital status legal
live with children*highest qual live with children*income source count
live with children*benefit income live with children*UNPAID ACTY COUNT06
live with children*sex female live with children*eur06
live with children*Mao06 live with children*Pac06 smoke*own residence
smoke*marital status legal smoke*highest qual smoke*income source count
smoke*benefit income smoke*UNPAID ACTY COUNT06 smoke*sex female smoke*eur06
smoke*Mao06 smoke*Pac06 own residence*marital status legal
own residence*highest qual own residence*income source count
own residence*benefit income own residence*UNPAID ACTY COUNT06
own residence*sex female own residence*eur06 own residence*Mao06
own residence*Pac06 marital status legal*highest qual
marital status legal*income source count marital status legal*benefit income
marital status legal*UNPAID ACTY COUNTO6 marital status legal*sex female
marital status legal*eur06 marital status legal*Mao06
marital status legal*PacO6 highest qual*income source count
highest qual*benefit income highest qual*UNPAID ACTY COUNT06
highest qual*sex female highest qual*eur06 highest qual*Mao06
highest qual*Pac06 income source count*benefit income
income source count*UNPAID ACTY COUNT06 income source count*sex female
income source count*eur06 income source count*Mao06 income source count*Pac06
benefit income*UNPAID ACTY COUNTO6 benefit income*sex female
benefit income*eur06 benefit income*Mao06 benefit income*Pac06
UNPAID ACTY COUNTO6*sex female UNPAID ACTY COUNTO6*eur06
UNPAID ACTY COUNT06*Mao06 UNPAID ACTY COUNT06*Pac06 sex female*eur06
sex female*Mao06 sex female*Pac06 eur06*Mao06 eur06*Pac06 Mao06*Pac06;
output out=adult5 pred=p;
run;
```

```
data ver2.interactionwgt06 (keep= ID linkind0601 interactionwgt0601);
set adult5;
interactionwgt0601=1/p;
run;
proc means data= ver2.wgt06;
var interactionwqt0601;
run;
proc means data= ver2.wqt06 (where=(linkind0601=1));
var interactionwqt0601;
run;
data adult6;
set adult5;
wgt = 1/p;
run;
proc corr data=adult6 (where=(test=1 & linkind0601=1));
var age yrs at addr same addr 5yrs ago NZ born yrs in NZ language indicator
Language count maori descent iwi ind iwi count religious live with parents
live with partner live with siblings live with children live alone
live with flatmates live with other difficulty acty count disability
disability ind smoke own residence marital status legal children born
had children highest qual income source count benefit income total income
income support hrs work mainjob work labour force status travel work
UNPAID ACTY COUNTO6 sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06
EthNS nzdep2006 oc06;
run;
**0601 children's interaction model;
*testing for important two-way interactions in sample of 10,000;
proc surveyselect data= child2 out=child10000 n=14500 seed=909090;
run;
data child10000;
set child10000;
if test=0;
run;
proc logistic data= child10000;
class age yrs at addr same addr 5yrs ago NZ born yrs in NZ language indicator
Language count maori descent iwi ind iwi count religious live with parents
live with partner live with siblings live with children live alone
live with flatmates live with other difficulty acty count disability
disability ind sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS
nzdep2006 /ref=first;
model linkind0601 (event='1') = age yrs at addr same addr 5yrs ago NZ born
yrs in NZ language indicator Language count maori descent iwi ind iwi count
religious live with parents live with partner live with siblings
live with children live alone live with flatmates live with other
difficulty acty count disability disability ind sex female eur06 Mao06 Pac06
Asian06 MELAA06 Other06 EthNS nzdep2006 /selection=stepwise slentry=.1
slstay=.05 hierarchy=single;
run;
```

```
proc logistic data=child2;
class yrs at addr same addr 5yrs ago yrs in NZ maori descent iwi ind
religious live with parents live with partner live with siblings disability
eur06 Mao06 Other06 nzdep2006 /ref=first;
model link0601 (event='1') = yrs at addr same addr 5yrs ago yrs in NZ
maori descent iwi ind religious live with parents live with partner
live with siblings disability eur06 Mao06 Other06 nzdep2006
yrs at addr*same addr 5yrs ago yrs at addr*yrs in NZ
yrs at addr*maori descent yrs at addr*iwi ind yrs at addr*religious
yrs at addr*live with parents yrs at addr*live with partner
yrs at addr*live with siblings yrs at addr*disability yrs at addr*eur06
yrs at addr*Mao06 yrs at addr*Other06 yrs at addr*nzdep2006
same addr 5yrs ago*yrs in NZ same addr 5yrs ago*maori descent
same addr 5yrs ago*iwi ind same addr 5yrs ago*religious
same addr 5yrs ago*live with parents same addr 5yrs ago*live with partner
same addr 5yrs ago*live with siblings same addr 5yrs ago*disability
same_addr_5yrs_ago*eur06 same_addr_5yrs_ago*Mao06 same_addr_5yrs_ago*Other06
same addr 5yrs ago*nzdep2006 yrs in NZ*maori descent yrs in NZ*iwi ind
yrs in NZ^*religious yrs in NZ^*live with parents yrs in NZ^*live with partner
yrs in NZ*live with siblings yrs in NZ*disability yrs in NZ*eur06
yrs in NZ*Mao06 yrs in NZ*Other06 yrs in NZ*nzdep2006 maori descent*iwi ind
maori descent*religious maori descent*live with parents
maori descent*live with partner maori descent*live with siblings
maori descent*disability maori descent*eur06 maori descent*Mao06
maori descent*Other06 maori descent*nzdep2006 iwi ind*religious
iwi ind*live with parents iwi ind*live with partner
iwi ind*live with siblings iwi ind*disability iwi ind*eur06 iwi ind*Mao06
iwi ind*Other06 iwi ind*nzdep2006 religious*live with parents
religious*live with partner religious*live with siblings religious*disability
religious*eur06 religious*Mao06 religious*Other06 religious*nzdep2006
live with parents*live with partner live with parents*live with siblings
live with parents*disability live with parents*eur06 live with parents*Mao06
live with parents*Other06 live with parents*nzdep2006
live with partner*live with siblings live with partner*disability
live with partner*eur06 live with partner*Mao06 live with partner*Other06
live with partner*nzdep2006 live with siblings*disability
live with siblings*eur06 live with siblings*Mao06 live with siblings*Other06
live with siblings*nzdep2006 disability*eur06 disability*Mao06
disability*Other06 disability*nzdep2006 eur06*Mao06 eur06*Other06
eur06*nzdep2006 Mao06*Other06 Mao06*nzdep2006 Other06*nzdep2006;
output out=child5 pred=p;
run;
*Storing the weights for the Interaction model weighted correlations;
data ver2.interactionchildwgt06 (keep= ID linkind0601 interactionwgt0601);
set child5;
interactionwgt0601=1/p;
run;
proc means data= ver2.interactionchildwgt06;
var interactionwgt0601;
run;
proc means data= ver2.interactionchildwgt06 (where=(linkind0601=1));
var interactionwgt0601;
run;
```

```
data child6;
set child5; wgt = 1/p;
proc corr data=child6 (where=(test=1 & linkind0601=1));
weight wgt;
var age yrs at addr same addr 5yrs ago NZ born yrs in NZ language indicator
Language count maori descent iwi ind iwi count religious live with parents
live with partner live with siblings live with children live alone
live with flatmates live with other difficulty acty count disability
disability ind sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS
nzdep2006;
run;
proc logistic data= child2;
class yrs at addr same addr 5yrs ago yrs in NZ maori descent iwi ind
religious live with parents live with partner live with siblings disability
eur06 Mao06 Other06 nzdep2006 /ref=first;
model link0601 (event='1') = yrs at addr same addr 5yrs ago yrs in NZ
maori descent iwi ind religious live with parents live with partner
live with siblings disability eur06 Mao06 Other06 nzdep2006
yrs at addr*same addr 5yrs ago;
output out=child5 pred=p;
run;
data child6;
set child5; wgt = 1/p;
run;
proc corr data=child6 (where=(test=1 & linkind0601=1));
weight wgt;
var age yrs_at_addr same_addr_5yrs_ago NZ_born yrs_in_NZ language_indicator
Language count maori descent iwi ind iwi count religious live with parents
live with partner live with siblings live with children live alone
live with flatmates live with other difficulty acty count disability
disability ind sex female eur06 Mao06 Pac06 Asian06 MELAA06 Other06 EthNS
nzdep2006;
run;
```