Barcelona crime longitudinal data quality

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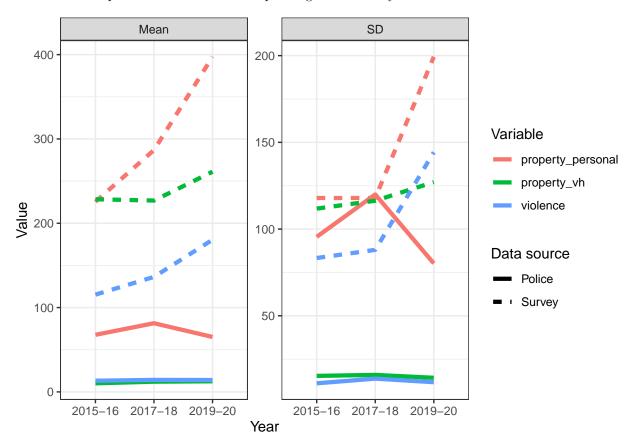
2021-03-11

Here I explore the Barcelona data that has three types of crimes: property vehicle, property personal and violence collected in surveys and official data over regions (76) and time (6 years). We group years by two in order to avoid having regions with 0s.

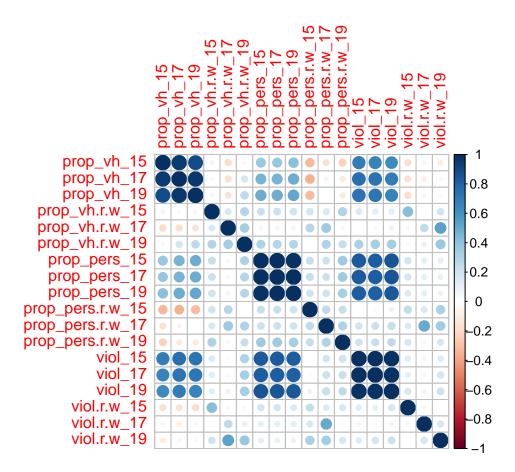
Here I concentrate on the weighted estimates from the survey (ending in ".r.w") and the official data.

Descriptives

First some descriptives. Bellow we observe quite big differences by data source.

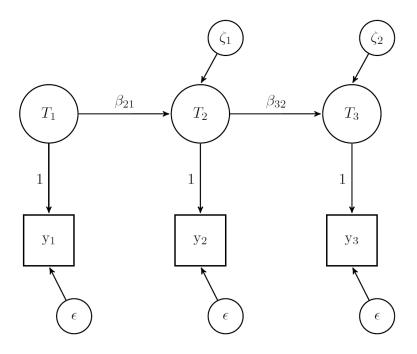


When we look at correlations we also see pretty striking patterns. First of all the consistency within measure is much higher for police data than survey data. Then, the relationship between of measures across data sources is very low. This could be problematic for any MTMM like modeling.



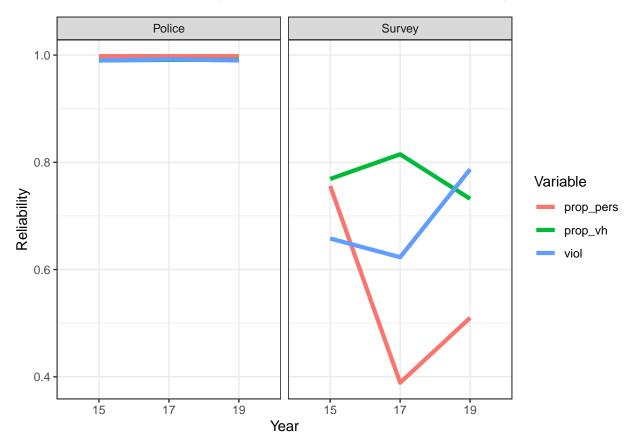
Quasi-simplex

A first way to look at the quality of the data is to use the quasi-simplex model. This assumes an autoregressive model of true scores and estimates reliability by assuming equal variance of error over time (see for more details: https://www.iser.essex.ac.uk/research/publications/working-papers/iser/2014-09.pdf).



I estimate the models using blavaan which does in the background SEM using Stan. I tried to use ML but it leads to negative variances (relative common occurrence for these models).

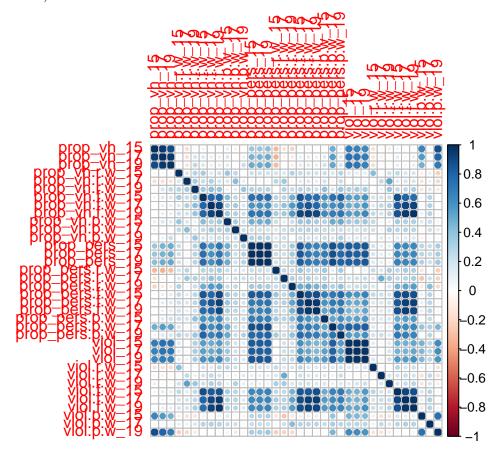
Here we plot the reliability by variable, data source and wave as estimated by quasi-simplex. Reliabilities are much lower for the survey data (as expected given the correlation matrices above).

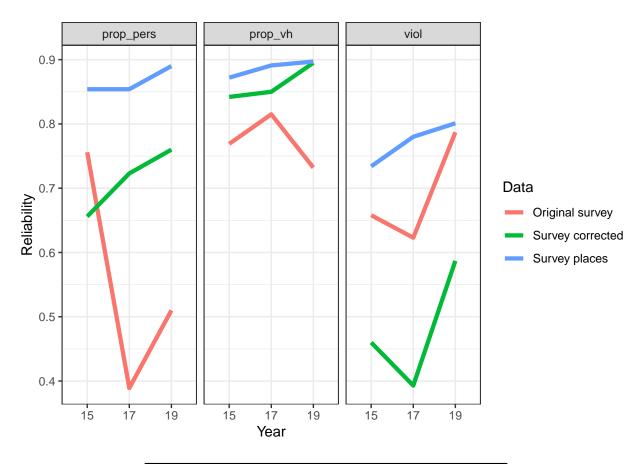


This is also obvious if we average reliability estimates.

group	var	reliability	reliability_source
Police	prop_pers	1.00	0.99
Police	$prop_vh$	0.99	0.99
Police	viol	0.99	0.99
Survey	$prop_pers$	0.55	0.67
Survey	$prop_vh$	0.77	0.67
Survey	viol	0.69	0.67

Given this and the point David made in a recent email let's have a look at the survey data about places where crimes happen (".f.w" - "Survey places") and looking only at crimes reported to the police (".p.w" - "Survey corrected").



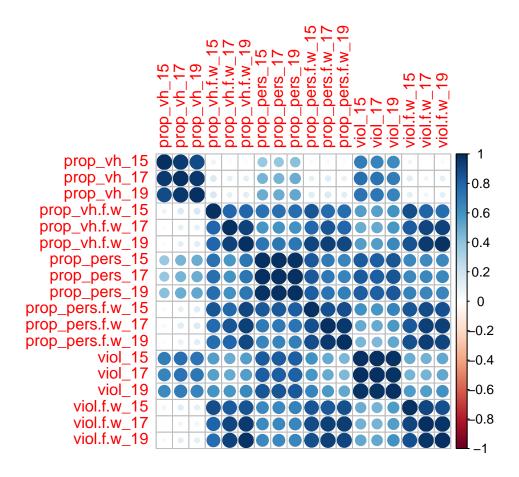


var	group	reliability	reliability_source
prop_pers	Original survey	0.55	0.67
$prop_pers$	Survey corrected	0.71	0.69
$prop_pers$	Survey places	0.87	0.84
$prop_vh$	Original survey	0.77	0.67
$prop_vh$	Survey corrected	0.86	0.69
$prop_vh$	Survey places	0.89	0.84
viol	Original survey	0.69	0.67
viol	Survey corrected	0.48	0.69
viol	Survey places	0.77	0.84

Overall seems that the ".p.w" measures have better quality so we'll use them in the next step.

Longitudinal variance decomposition

Next we will expand the quasi-simplex. We will make a measurement model at each wave that includes the measure of interest from the police and the corrected survey data in addition to include the simplex change in time. The statistic of interest here would be the standardized loading on trait which can be seen as "validity".



Property vehicle

```
## blavaan (0.3-15) results of 2000 samples after 8000 adapt/burnin iterations
##
##
     Number of observations
                                                          73
##
##
     Number of missing patterns
                                                           1
##
##
     Statistic
                                                 MargLogLik
                                                                     PPP
##
     Value
                                                   -645.804
                                                                   0.000
##
## Latent Variables:
##
                       Estimate Post.SD pi.lower pi.upper
                                                               Std.lv Std.all
##
     t1 =~
##
       prop_vh_15
                          1.000
                                                                0.627
                                                                          0.959
                          1.000
                                                                          0.258
##
       prop_vh.f.w_15
                                                                0.627
     t2 =~
##
                                                                0.685
                                                                          0.994
##
       prop_vh_17
                          1.000
                                                                0.685
                                                                          0.254
##
       prop_vh.f.w_17
                          1.000
##
     t3 =~
##
       prop_vh_19
                          1.000
                                                                0.680
                                                                          0.974
##
       prop_vh.f.w_19
                          1.000
                                                                0.680
                                                                          0.257
                Prior
##
        Rhat
##
##
          NA
```

```
##
          NA
##
##
          NA
##
          NA
##
##
          NA
##
          NA
##
##
  Regressions:
##
                                 Post.SD pi.lower pi.upper
                                                                 Std.lv Std.all
                        Estimate
##
     t2 ~
##
                                               0.936
       t1
                           1.069
                                     0.069
                                                         1.204
                                                                   0.978
                                                                             0.978
##
     t3 ~
##
                           0.970
                                     0.041
                                                0.89
                                                         1.052
                                                                   0.978
                                                                             0.978
       t2
##
        Rhat
                 Prior
##
##
       1.000
                 normal(0,10)
##
                 normal(0,10)
##
       1.000
##
##
  Intercepts:
##
                        Estimate Post.SD pi.lower pi.upper
                                                                 Std.lv
                                                                          Std.all
##
                                                                             3.233
                           2.112
                                     0.077
                                               1.961
                                                         2.264
                                                                   2.112
      .prop_vh_15
##
                           7.445
                                     0.282
                                               6.887
                                                         8.001
                                                                   7.445
                                                                             3.064
      .prop_vh.f.w_15
##
                           2.267
                                     0.081
                                               2.106
                                                         2.426
                                                                   2.267
                                                                             3.290
      .prop_vh_17
##
      .prop_vh.f.w_17
                           7.662
                                     0.319
                                               7.032
                                                         8.292
                                                                   7.662
                                                                             2.845
##
                           2.319
                                     0.082
                                               2.157
                                                         2.481
                                                                   2.319
                                                                             3.322
      .prop_vh_19
##
                           7.622
                                     0.307
                                               7.018
                                                          8.22
                                                                   7.622
                                                                             2.880
      .prop_vh.f.w_19
##
                           0.000
                                                                   0.000
                                                                             0.000
       t1
                           0.000
##
      .t2
                                                                   0.000
                                                                             0.000
##
      .t3
                           0.000
                                                                   0.000
                                                                             0.000
##
        Rhat
                 Prior
##
       1.001
                 normal(0,32)
##
       1.000
                 normal(0,32)
##
       1.001
                 normal(0,32)
##
       1.000
                 normal(0,32)
##
       1.001
                 normal(0,32)
##
       1.000
                 normal(0,32)
##
           NA
##
          NA
##
           NA
##
##
  Variances:
##
                                   Post.SD pi.lower pi.upper
                                                                          Std.all
                        Estimate
                                                                 Std.lv
##
                           0.034
                                     0.018
                                                   0
                                                         0.066
                                                                   0.034
                                                                             0.079
      .prop_vh_15
##
                           5.514
                                     0.950
                                                3.96
                                                         7.647
                                                                             0.933
                                                                   5.514
      .prop_vh.f.w_15
##
                           0.005
                                     0.005
                                                         0.019
                                                                   0.005
                                                                             0.012
      .prop_vh_17
                                                   0
##
                           6.786
                                               4.856
                                                         9.371
                                                                   6.786
                                                                             0.935
      .prop_vh.f.w_17
                                     1.161
##
      .prop_vh_19
                           0.025
                                     0.017
                                                   0
                                                         0.057
                                                                   0.025
                                                                             0.052
##
                                               4.714
                                                         9.029
      .prop_vh.f.w_19
                           6.542
                                     1.115
                                                                   6.542
                                                                             0.934
##
                           0.393
                                     0.077
                                               0.265
                                                         0.566
                                                                   1.000
                                                                             1.000
       t1
##
      .t2
                           0.020
                                     0.019
                                                         0.063
                                                                   0.043
                                                                             0.043
                                                   0
##
      .t3
                           0.020
                                     0.017
                                                   0
                                                         0.054
                                                                   0.044
                                                                             0.044
##
        Rhat
                 Prior
```

```
1.000 gamma(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
##
##
       1.000 gamma(1,.5)[sd]
       1.000 gamma(1,.5)[sd]
##
##
       1.000 gamma(1,.5)[sd]
       1.000 gamma(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
##
##
       1.000 gamma(1,.5)[sd]
```

Property personal

```
## blavaan (0.3-15) results of 2000 samples after 8000 adapt/burnin iterations
##
##
     Number of observations
                                                          73
##
##
     Number of missing patterns
                                                           1
##
##
                                                                     PPP
     Statistic
                                                 MargLogLik
##
     Value
                                                   -579.389
                                                                   0.000
##
## Latent Variables:
##
                                                               Std.lv Std.all
                       Estimate Post.SD pi.lower pi.upper
##
     t1 =~
                          1.000
                                                                0.852
                                                                          0.996
##
       prop_pers_15
##
       prp_prs.f.w_15
                          1.000
                                                                0.852
                                                                          0.321
##
     t2 =~
                                                                0.896
                                                                          0.999
##
       prop_pers_17
                          1.000
##
       prp_prs.f.w_17
                          1.000
                                                                0.896
                                                                          0.330
##
     t3 =~
##
       prop_pers_19
                          1.000
                                                                0.780
                                                                          0.996
##
                          1.000
                                                                0.780
                                                                          0.268
       prp_prs.f.w_19
        Rhat
                Prior
##
##
##
          NA
##
          NA
##
##
          NA
##
          NA
##
##
          NA
##
          NA
##
## Regressions:
##
                       Estimate Post.SD pi.lower pi.upper
                                                               Std.lv Std.all
##
     t2 ~
##
       t1
                          1.048
                                   0.018
                                             1.013
                                                       1.083
                                                                0.996
                                                                          0.996
     t3 ~
##
                          0.867
                                   0.015
                                             0.838
                                                      0.896
##
       t2
                                                                0.996
                                                                          0.996
##
        Rhat
                Prior
##
##
       1.000
                normal(0,10)
##
```

```
normal(0,10)
##
       1.000
##
##
   Intercepts:
##
                                  Post.SD pi.lower pi.upper
                                                                 Std.lv
                                                                          Std.all
                       Estimate
##
      .prop_pers_15
                           3.771
                                     0.100
                                              3.573
                                                        3.962
                                                                  3.771
                                                                            4.407
##
                           6.154
                                     0.310
                                              5.543
                                                        6.751
                                                                  6.154
                                                                            2.315
      .prp_prs.f.w_15
##
                           3.904
                                     0.105
                                              3.695
                                                        4.106
                                                                  3.904
                                                                            4.351
      .prop_pers_17
##
                                              6.208
                                                        7.459
      .prp_prs.f.w_17
                           6.842
                                     0.316
                                                                  6.842
                                                                            2.523
##
      .prop_pers_19
                           3.812
                                     0.091
                                              3.629
                                                        3.989
                                                                  3.812
                                                                            4.864
##
                                     0.342
                                              6.386
                                                                            2.427
      .prp_prs.f.w_19
                           7.072
                                                         7.74
                                                                  7.072
##
       t1
                           0.000
                                                                  0.000
                                                                            0.000
##
                           0.000
                                                                            0.000
      .t2
                                                                  0.000
##
                           0.000
                                                                  0.000
                                                                            0.000
      .t3
##
        Rhat
                 Prior
##
       1.000
                 normal(0,32)
##
          NA
##
          NA
##
          NA
##
## Variances:
##
                       Estimate
                                  Post.SD pi.lower pi.upper
                                                                 Std.lv
                                                                          Std.all
##
                           0.006
                                     0.004
                                                   0
                                                        0.014
                                                                  0.006
                                                                            0.008
      .prop_pers_15
##
                           6.341
                                     1.076
                                               4.565
                                                        8.757
                                                                  6.341
                                                                            0.897
      .prp_prs.f.w_15
##
                           0.002
                                     0.002
                                                        0.006
                                                                  0.002
                                                                            0.002
      .prop_pers_17
                                                   0
##
      .prp_prs.f.w_17
                           6.551
                                     1.115
                                               4.717
                                                         9.08
                                                                  6.551
                                                                            0.891
                                                        0.013
##
      .prop_pers_19
                           0.006
                                     0.004
                                                   0
                                                                  0.006
                                                                            0.009
##
      .prp_prs.f.w_19
                           7.884
                                     1.362
                                                5.65
                                                       10.977
                                                                  7.884
                                                                            0.928
##
                                     0.125
                                               0.522
                                                        1.009
       t1
                           0.726
                                                                  1.000
                                                                            1.000
##
      .t2
                           0.006
                                     0.005
                                                   0
                                                        0.015
                                                                  0.007
                                                                            0.007
##
      .t3
                           0.005
                                     0.004
                                                   0
                                                        0.013
                                                                  0.008
                                                                            0.008
##
        Rhat
                 Prior
##
       1.000 \text{ gamma}(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
Violence
## blavaan (0.3-15) results of 2000 samples after 8000 adapt/burnin iterations
##
##
                                                            73
     Number of observations
##
##
     Number of missing patterns
                                                             1
```

```
##
                                                  MargLogLik
##
     Statistic
                                                                      PPP
                                                    -570.826
                                                                    0.000
##
     Value
##
## Latent Variables:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                Std.lv Std.all
##
     t1 =~
                          1.000
                                                                           0.994
##
                                                                 0.551
       viol_15
##
       viol.f.w_15
                          1.000
                                                                 0.551
                                                                           0.195
##
     t2 =~
##
       viol_17
                          1.000
                                                                 0.600
                                                                           0.990
##
                           1.000
                                                                 0.600
                                                                           0.194
       viol.f.w_17
##
     t3 =~
##
                          1.000
                                                                 0.553
                                                                           0.995
       viol_19
##
       viol.f.w_19
                          1.000
                                                                 0.553
                                                                           0.184
##
        Rhat
                 Prior
##
##
          NA
##
          NA
##
##
          NA
##
          NA
##
##
          NA
##
          NA
##
##
  Regressions:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                Std.lv Std.all
##
     t2 ~
##
                          1.083
                                    0.028
                                              1.028
                                                       1.138
                                                                 0.994
                                                                           0.994
       t1
     t3 ~
##
##
       t2
                          0.916
                                    0.023
                                              0.871
                                                       0.962
                                                                 0.994
                                                                           0.994
##
        Rhat
                 Prior
##
       1.000
                 normal(0,10)
##
##
##
       1.000
                 normal(0,10)
##
## Intercepts:
##
                                                                Std.lv Std.all
                       Estimate Post.SD pi.lower pi.upper
##
                          2.477
                                    0.065
                                              2.349
                                                       2.606
                                                                 2.477
                                                                           4.470
      .viol_15
                          5.659
                                    0.333
                                              4.996
                                                       6.303
                                                                           2.004
##
      .viol.f.w_15
                                                                 5.659
##
      .viol_17
                          2.499
                                    0.071
                                              2.357
                                                       2.638
                                                                 2.499
                                                                           4.124
##
      .viol.f.w_17
                          5.932
                                    0.365
                                              5.217
                                                       6.659
                                                                 5.932
                                                                           1.922
##
      .viol_19
                          2.533
                                    0.065
                                              2.402
                                                       2.661
                                                                 2.533
                                                                           4.556
                                    0.350
                                                       7.039
##
                          6.357
                                              5.656
                                                                 6.357
                                                                           2.118
      .viol.f.w_19
##
       t1
                          0.000
                                                                 0.000
                                                                           0.000
##
      .t2
                          0.000
                                                                 0.000
                                                                           0.000
##
                          0.000
                                                                 0.000
                                                                           0.000
      .t3
##
        Rhat
                 Prior
                 normal(0,32)
##
       1.000
##
       1.000
                 normal(0,32)
       1.000
##
                 normal(0,32)
##
       1.000
                 normal(0,32)
```

```
##
       1.000
                 normal(0,32)
##
       1.000
                 normal(0,32)
##
          NA
##
          NA
##
          NA
##
## Variances:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                 Std.lv
                                                                         Std.all
##
      .viol_15
                           0.004
                                     0.003
                                                   0
                                                        0.009
                                                                  0.004
                                                                            0.011
##
                           7.672
                                     1.283
                                              5.567
                                                       10.577
                                                                            0.962
      .viol.f.w_15
                                                                  7.672
##
      .viol_17
                           0.007
                                     0.002
                                              0.003
                                                        0.012
                                                                  0.007
                                                                            0.020
##
      .viol.f.w_17
                           9.168
                                     1.565
                                              6.626
                                                       12.732
                                                                  9.168
                                                                            0.962
##
      .viol_19
                           0.003
                                     0.003
                                                   0
                                                        0.009
                                                                  0.003
                                                                            0.010
##
      .viol.f.w_19
                           8.703
                                                       11.958
                                                                            0.966
                                     1.472
                                              6.262
                                                                  8.703
##
       t1
                           0.304
                                     0.053
                                              0.217
                                                        0.422
                                                                  1.000
                                                                            1.000
##
      .t2
                           0.004
                                     0.003
                                                   0
                                                        0.011
                                                                  0.012
                                                                            0.012
##
      .t3
                           0.004
                                     0.003
                                                   0
                                                        0.009
                                                                  0.012
                                                                            0.012
##
        Rhat
                 Prior
##
       1.001 gamma(1,.5)[sd]
       1.000 gamma(1,.5)[sd]
##
##
       1.000 gamma(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
       1.000 gamma(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
##
##
       1.000 gamma(1,.5)[sd]
##
       1.001 gamma(1,.5)[sd]
##
       1.001 gamma(1,.5)[sd]
```

Include stable method effect

Additionally, we can expand this model and include a stable method effect. Now the standardized loading on the method effect is "systematic bias" while the standardized loading on trait can be seen as "reliability" I think. These models are getting hard to estimate so we need to trade lightly.

Property vehicle

```
## blavaan (0.3-15) results of 2000 samples after 8000 adapt/burnin iterations
##
                                                          73
##
     Number of observations
##
##
     Number of missing patterns
                                                           1
##
##
     Statistic
                                                  MargLogLik
                                                                      PPP
                                                   -3048.089
                                                                    0.010
##
     Value
##
##
  Latent Variables:
##
                                  Post.SD pi.lower pi.upper
                       Estimate
                                                                Std.lv
                                                                        Std.all
##
     t1 =~
##
                          1.000
       prop_vh_15
                                                                 1.748
                                                                          0.115
       prop_vh.p.w_15
##
                          1.000
                                                                 1.748
                                                                          0.067
     t2 =~
##
##
                          1.000
                                                                 3.163
                                                                          0.208
       prop_vh_17
                          1.000
                                                                 3.163
##
       prop_vh.p.w_17
                                                                          0.113
```

```
t3 =~
##
                          1.000
                                                                7.679
                                                                          0.495
##
       prop_vh_19
##
                          1.000
                                                                7.679
                                                                          0.212
       prop_vh.p.w_19
     pol =~
##
                          1.000
                                                               15.482
                                                                          1.018
##
       prop_vh_15
##
       prop_vh_17
                          1.000
                                                               15.482
                                                                          1.019
##
       prop_vh_19
                          1.000
                                                               15.482
                                                                          0.997
     surv =~
##
##
       prop_vh.p.w_15
                          1.000
                                                               14.210
                                                                          0.547
##
                          1.000
                                                               14.210
                                                                          0.508
       prop_vh.p.w_17
##
       prop_vh.p.w_19
                          1.000
                                                               14.210
                                                                          0.393
##
        Rhat
                Prior
##
##
          NA
##
          NA
##
          NA
##
##
          NA
##
          NA
##
          NA
##
## Regressions:
##
                       Estimate Post.SD pi.lower pi.upper
                                                               Std.lv Std.all
##
     t2 ~
##
                          1.236
                                    5.592 -12.229
                                                      13.151
                                                                0.683
                                                                          0.683
       t1
##
     t3 ~
                          2.365
                                    2.309
                                            -1.242
                                                       7.703
                                                                0.974
                                                                          0.974
##
       t2
##
        Rhat
                 Prior
##
       1.056
                 normal(0,10)
##
##
                 normal(0,10)
##
       1.022
##
## Covariances:
##
                       Estimate Post.SD pi.lower pi.upper
                                                               Std.lv Std.all
##
     t1 ~~
                        -10.070
                                                               -0.372
                                                                         -0.372
##
                                   20.019 -56.578
                                                      17.758
       pol
##
                          0.268
                                    8.948 -18.158
                                                      18.928
                                                                0.011
                                                                          0.011
       surv
##
     pol ~~
##
                         29.819
                                   36.609 -41.821 104.529
                                                                          0.136
       surv
                                                                0.136
##
        Rhat
                 Prior
##
                    beta(1,1)
       1.045
##
##
       1.019
                    beta(1,1)
##
```

```
##
       1.009
                     beta(1,1)
##
##
   Intercepts:
##
                        Estimate
                                   Post.SD pi.lower pi.upper
                                                                  Std.lv
                                                                          Std.all
##
       .prop_vh_15
                          10.138
                                     1.803
                                               6.451
                                                        13.644
                                                                  10.138
                                                                             0.666
##
                          38.188
                                     3.018
                                              32.376
                                                        44.127
                                                                  38.188
                                                                             1.470
       .prop_vh.p.w_15
##
                          12.042
                                     1.766
                                               8.486
                                                        15.497
                                                                  12.042
                                                                             0.793
       .prop_vh_17
##
                          39.561
                                     3.323
                                              32.926
                                                                  39.561
                                                                             1.415
       .prop_vh.p.w_17
                                                        45.987
##
       .prop_vh_19
                          12.481
                                     1.688
                                               9.089
                                                        15.798
                                                                  12.481
                                                                             0.804
##
                          45.067
                                     4.251
       .prop_vh.p.w_19
                                              36.712
                                                        53.315
                                                                  45.067
                                                                             1.245
##
       t1
                           0.000
                                                                   0.000
                                                                             0.000
##
                           0.000
       .t2
                                                                   0.000
                                                                             0.000
                           0.000
##
                                                                   0.000
                                                                             0.000
       .t3
##
                           0.000
                                                                   0.000
                                                                             0.000
       pol
##
       surv
                           0.000
                                                                   0.000
                                                                             0.000
##
        Rhat
                 Prior
##
       1.004
                 normal(0,32)
##
       1.001
                 normal(0,32)
##
       1.004
                 normal(0,32)
##
       1.002
                 normal(0,32)
##
       1.004
                 normal(0,32)
##
       1.002
                 normal(0,32)
##
           NA
##
           NA
           NΑ
##
##
           NA
##
           NA
##
##
   Variances:
##
                        Estimate
                                   Post.SD pi.lower pi.upper
                                                                  Std.lv
                                                                          Std.all
##
       .prop_vh_15
                           8.839
                                     8.904
                                               0.006
                                                        26.737
                                                                   8.839
                                                                             0.038
##
       .prop_vh.p.w_15
                         469.374
                                   101.079
                                              304.15
                                                      700.177
                                                                 469.374
                                                                             0.695
##
       .prop_vh_17
                           5.966
                                     3.929
                                                0.01
                                                        12.547
                                                                   5.966
                                                                             0.026
                         568.670
##
                                             380.671
                                                       818.471
                                                                 568.670
                                                                             0.728
       .prop_vh.p.w_17
                                   113.766
##
       .prop_vh_19
                           1.175
                                     1.871
                                               0.001
                                                         6.315
                                                                   1.175
                                                                             0.005
      .prop_vh.p.w_19 1047.273
##
                                   169.757
                                             755.431 1423.391 1047.273
                                                                             0.800
##
       t1
                           3.056
                                     7.528
                                               0.004
                                                        21.016
                                                                   1.000
                                                                             1.000
##
       .t2
                           5.335
                                     5.322
                                               0.007
                                                        17.417
                                                                   0.533
                                                                             0.533
##
       .t3
                           3.004
                                     4.554
                                               0.002
                                                        17.024
                                                                   0.051
                                                                             0.051
##
                         239.695
                                    54.273
                                             147.095
                                                       355.226
                                                                   1.000
                                                                             1.000
       pol
##
       surv
                         201.912
                                    78.699
                                              41.173
                                                       365.176
                                                                   1.000
                                                                             1.000
##
        Rhat
                 Prior
##
       1.018 gamma(1,.5)[sd]
##
       1.001 gamma(1,.5)[sd]
##
       1.019 gamma(1,.5)[sd]
##
       1.004 gamma(1,.5)[sd]
##
       1.003 gamma(1,.5)[sd]
##
       1.003 gamma(1,.5)[sd]
##
       1.027 gamma(1,.5)[sd]
##
       1.026 gamma(1,.5)[sd]
##
       1.040 gamma(1,.5)[sd]
##
       1.035 gamma(1,.5)[sd]
##
       1.002 gamma(1,.5)[sd]
```

Property personal

```
## ** WARNING ** blavaan (0.3-15) did NOT converge after 8000 adapt+burnin iterations
## ** WARNING ** Proceed with caution
##
##
     Number of observations
                                                         73
##
##
     Number of missing patterns
                                                          1
##
##
     Statistic
                                                 MargLogLik
                                                                     PPP
##
     Value
                                                  -6039.737
                                                                   0.000
##
## Latent Variables:
                      Estimate Post.SD pi.lower pi.upper
##
                                                              Std.lv Std.all
##
     t1 =~
##
       prop_pers_15
                          1.000
                                                               13.812
                                                                         0.180
                          1.000
                                                               13.812
##
                                                                         0.533
       prp_prs.p.w_15
##
    t2 =~
##
                                                               53.971
                                                                         1.057
       prop_pers_17
                          1.000
       prp_prs.p.w_17
##
                          1.000
                                                               53.971
                                                                         0.903
##
     t3 =~
##
                          1.000
                                                               10.999
                                                                         0.149
       prop_pers_19
##
                                                               10.999
                                                                         0.251
       prp_prs.p.w_19
                          1.000
     pol =~
##
                                                               66.852
##
       prop_pers_15
                          1.000
                                                                         0.869
##
       prop_pers_17
                          1.000
                                                               66.852
                                                                         1.309
                                                               66.852
                                                                         0.905
##
       prop_pers_19
                          1.000
##
     surv =~
                          1.000
                                                               10.861
                                                                         0.419
##
       prp_prs.p.w_15
                                                                         0.182
##
                          1.000
                                                               10.861
       prp_prs.p.w_17
##
       prp_prs.p.w_19
                          1.000
                                                               10.861
                                                                         0.248
##
        Rhat
                Prior
##
##
          NA
##
          NA
##
          NA
##
##
          NA
##
          NA
##
          NA
##
## Regressions:
##
                      Estimate Post.SD pi.lower pi.upper
                                                              Std.lv Std.all
##
     t2 ~
                                   8.595 -23.236
##
       t1
                         -3.907
                                                      2.449
                                                              -1.000
                                                                        -1.000
```

```
##
     t3 ~
                                             -0.862
##
       t2
                          -0.168
                                    0.418
                                                        0.238
                                                                 -0.824
                                                                          -0.824
##
        Rhat
                 Prior
##
##
       2.570
                 normal(0,10)
##
##
       5.731
                 normal(0,10)
##
##
   Covariances:
##
                                                                         Std.all
                       Estimate
                                 Post.SD pi.lower pi.upper
                                                                 Std.lv
##
     t1 ~~
                                  576.176 -198.678 1340.293
##
                         611.079
                                                                 0.662
                                                                           0.662
       pol
                         -11.402
                                   18.720 -51.922
                                                                 -0.076
                                                                          -0.076
##
       surv
                                                       22,222
##
     pol ~~
##
                         487.318 625.878 -75.309 1583.793
                                                                  0.671
                                                                           0.671
       surv
##
        Rhat
                 Prior
##
##
       4.694
                    beta(1,1)
##
       1.213
                    beta(1,1)
##
##
       5.079
                    beta(1,1)
##
##
  Intercepts:
##
                                 Post.SD pi.lower pi.upper
                                                                         Std.all
                       Estimate
                                                                 Std.lv
##
                          52.569
                                    7.979
                                                                           0.683
      .prop_pers_15
                                             36.678
                                                       67.978
                                                                 52.569
##
      .prp_prs.p.w_15
                          19.455
                                    2.911
                                             13.781
                                                       25.162
                                                                 19.455
                                                                            0.751
##
                          62.370
                                   10.049
                                             42.457
                                                       81.695
                                                                 62.370
                                                                            1.221
      .prop_pers_17
##
                                    4.513
                                             14.262
                                                       31.966
                                                                           0.388
      .prp_prs.p.w_17
                          23.187
                                                                 23.187
##
                                    6.895
                          52.172
                                             38.491
                                                        65.41
                                                                 52.172
                                                                           0.706
      .prop_pers_19
##
                                             28.787
                                                       47.824
                          38.325
                                    4.858
                                                                 38.325
                                                                           0.874
      .prp_prs.p.w_19
##
       t1
                           0.000
                                                                  0.000
                                                                            0.000
##
      .t2
                           0.000
                                                                  0.000
                                                                            0.000
##
                           0.000
      .t3
                                                                  0.000
                                                                            0.000
##
                           0.000
                                                                  0.000
                                                                            0.000
       pol
##
       surv
                           0.000
                                                                  0.000
                                                                            0.000
##
        Rhat
                 Prior
##
       1.002
                 normal(0,32)
##
       1.003
                 normal(0,32)
##
       1.002
                 normal(0,32)
##
       1.003
                 normal(0,32)
##
       1.001
                 normal(0,32)
##
       1.001
                 normal(0,32)
          NA
##
##
          NA
##
          NA
          NA
##
##
          NA
##
##
   Variances:
##
                       Estimate
                                  Post.SD pi.lower pi.upper
                                                                 Std.lv
                                                                         Std.all
##
                          33.914
                                    6.469
                                             22.995
                                                                 33.914
                                                                           0.006
                                                       48.339
      .prop_pers_15
##
      .prp_prs.p.w_15
                        385.699
                                   66.001
                                           274.858
                                                                           0.574
                                                      530.219
                                                               385.699
##
      .prop_pers_17
                           1.289
                                    2.027
                                              0.001
                                                        7.217
                                                                  1.289
                                                                           0.000
##
      .prp_prs.p.w_17 453.368
                                   74.555
                                           327.437
                                                       617.53 453.368
                                                                            0.127
```

```
0.04
##
      .prop_pers_19
                         66.192
                                  45.004
                                                     138.33
                                                              66.192
                                                                         0.012
##
      .prp_prs.p.w_19 1699.358
                                 267.875 1241.078 2281.625 1699.358
                                                                         0.884
                                            0.648 438.725
                                                                         1.000
##
                        190.768
                                 156.558
                                                               1.000
##
                          1.100
                                   2.036
                                                      6.648
                                                               0.000
                                                                         0.000
      .t2
                                                0
##
      .t3
                         38.825
                                  41.991
                                            0.012 121.946
                                                               0.321
                                                                         0.321
##
                       4469.227 1163.417 2872.12 6848.471
                                                               1.000
                                                                         1.000
       pol
##
       surv
                       117.969 153.721
                                            0.003 413.131
                                                               1.000
                                                                         1.000
##
        Rhat
                Prior
##
       1.011 gamma(1,.5)[sd]
##
       1.004 gamma(1,.5)[sd]
##
       1.000 gamma(1,.5)[sd]
##
       1.022 gamma(1,.5)[sd]
##
       1.001 gamma(1,.5)[sd]
       1.008 gamma(1,.5)[sd]
##
       2.812 gamma(1,.5)[sd]
##
##
       1.022 gamma(1,.5)[sd]
##
       1.002 gamma(1,.5)[sd]
       2.027 gamma(1,.5)[sd]
##
       3.913 gamma(1,.5)[sd]
##
```

Violence

```
## ** WARNING ** blavaan (0.3-15) did NOT converge after 8000 adapt+burnin iterations
## ** WARNING ** Proceed with caution
##
##
     Number of observations
                                                          73
##
##
     Number of missing patterns
                                                           1
##
##
     Statistic
                                                 MargLogLik
                                                                     PPP
##
     Value
                                                  -7188.764
                                                                   0.000
##
## Latent Variables:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                Std.lv Std.all
##
     t1 =~
##
       viol_15
                          1.000
                                                                 2.742
                                                                           0.255
##
                          1.000
                                                                 2.742
                                                                           0.081
       viol.p.w_15
##
     t2 =~
##
       viol 17
                          1.000
                                                                 0.917
                                                                           0.092
##
                          1.000
                                                                 0.917
                                                                           0.071
       viol.p.w_17
##
     t3 =~
##
       viol_19
                          1.000
                                                                 1.760
                                                                           0.173
                          1.000
                                                                           0.018
##
       viol.p.w_19
                                                                 1.760
     pol =~
##
                          1.000
                                                                 9.942
                                                                           0.925
##
       viol_15
##
       viol 17
                          1.000
                                                                 9.942
                                                                           0.995
##
       viol_19
                          1.000
                                                                 9.942
                                                                           0.978
##
     surv =~
##
       viol.p.w_15
                          1.000
                                                                 3.301
                                                                           0.097
                                                                           0.255
##
       viol.p.w_17
                          1.000
                                                                 3.301
##
       viol.p.w_19
                          1.000
                                                                 3.301
                                                                           0.034
##
        Rhat
                Prior
##
```

```
##
          NA
##
          NA
##
          NA
##
##
          NA
##
          NA
##
          NA
##
## Regressions:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                Std.lv Std.all
     t2 ~
##
                                                         9.85
##
       t1
                         -0.077
                                    5.858 -15.344
                                                                 -0.230
                                                                          -0.230
##
     t3 ~
##
       t2
                          1.228
                                    2.618
                                             -0.11
                                                        9.553
                                                                  0.640
                                                                           0.640
##
        Rhat
                 Prior
##
##
       1.798
                normal(0,10)
##
##
       1.826
                 normal(0,10)
##
## Covariances:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                 Std.lv Std.all
##
     t1 ~~
##
                          4.397
                                   20.349
                                            -46.74
                                                       31.576
                                                                  0.161
                                                                           0.161
       pol
                                                        3.475
##
                         -2.566
                                    5.914 -20.319
                                                                 -0.283
                                                                          -0.283
       surv
##
     pol ~~
                         18.992
                                                       86.808
##
       surv
                                   24.755
                                             -6.74
                                                                  0.579
                                                                           0.579
##
        Rhat
                 Prior
##
                    beta(1,1)
##
       2.869
##
       1.775
                    beta(1,1)
##
##
       1.818
                    beta(1,1)
##
## Intercepts:
##
                       Estimate Post.SD pi.lower pi.upper
                                                                 Std.lv Std.all
                                                                           1.223
##
                         13.146
                                    1.246
                                            10.782
                                                       15.618
      .viol_15
                                                                 13.146
##
                         14.986
                                    4.022
                                             7.276
                                                        22.74
                                                                 14.986
                                                                           0.441
      .viol.p.w_15
##
      .viol_17
                         14.104
                                    1.543
                                            11.178
                                                       17.165
                                                                 14.104
                                                                           1.411
                                                       13.022
##
      .viol.p.w_17
                          9.862
                                    1.609
                                               6.67
                                                                  9.862
                                                                           0.761
##
                         13.985
                                    1.330
                                                       16.613
                                                                 13.985
                                                                           1.376
      .viol_19
                                            11.458
##
      .viol.p.w_19
                         29.770
                                   10.624
                                             8.489
                                                       50.872
                                                                 29.770
                                                                           0.307
##
                          0.000
                                                                  0.000
                                                                           0.000
       t1
                                                                           0.000
##
                          0.000
      .t2
                                                                  0.000
##
                          0.000
                                                                  0.000
                                                                           0.000
      .t3
```

```
0.000
                                                                   0.000
                                                                             0.000
##
       pol
                           0.000
                                                                   0.000
                                                                             0.000
##
       surv
        Rhat
##
                 Prior
##
       1.012
                 normal(0,32)
##
       1.007
                 normal(0,32)
##
       1.011
                 normal(0,32)
##
       1.001
                 normal(0,32)
       1.012
##
                 normal(0,32)
##
       1.001
                 normal(0,32)
##
          NA
##
          NA
##
          NA
##
          NA
##
          NA
##
##
   Variances:
##
                                  Post.SD pi.lower pi.upper
                                                                           Std.all
                       Estimate
                                                                  Std.lv
                                                                             0.004
##
      .viol_15
                           0.418
                                     0.411
                                              0.001
                                                         1.456
                                                                   0.418
##
      .viol.p.w_15
                        1142.639
                                  167.983
                                            862.058
                                                      1528.793 1142.639
                                                                             0.989
##
      .viol_17
                           0.868
                                    0.873
                                              0.001
                                                         2.997
                                                                   0.868
                                                                             0.009
      .viol.p.w_17
##
                         155.586
                                    27.554
                                             109.47
                                                       217.934
                                                                 155.586
                                                                             0.928
##
      .viol_19
                           2.211
                                     1.650
                                              0.004
                                                         5.259
                                                                   2.211
                                                                             0.021
##
      .viol.p.w_19
                        9364.763 1124.782 7407.947 11801.219 9364.763
                                                                             0.998
##
       t1
                           7.519
                                     9.308
                                              0.028
                                                        33.908
                                                                   1.000
                                                                             1.000
##
      .t2
                           0.796
                                    0.888
                                              0.001
                                                         3.056
                                                                   0.947
                                                                             0.947
##
      .t3
                           1.828
                                    1.598
                                              0.003
                                                         5.024
                                                                   0.590
                                                                             0.590
##
       pol
                          98.848
                                    43.400
                                                33.3
                                                       199.292
                                                                   1.000
                                                                             1.000
##
                          10.900
                                    15.967
                                              0.006
                                                        58.349
                                                                   1.000
                                                                             1.000
       surv
##
        Rhat
                 Prior
##
       1.005 gamma(1,.5)[sd]
##
       1.003 gamma(1,.5)[sd]
##
       1.029 gamma(1,.5)[sd]
##
       1.009 gamma(1,.5)[sd]
##
       1.020 gamma(1,.5)[sd]
##
       1.003 gamma(1,.5)[sd]
##
       1.177 gamma(1,.5)[sd]
##
       1.062 gamma(1,.5)[sd]
##
       1.011 gamma(1,.5)[sd]
       1.831 gamma(1,.5)[sd]
##
##
       1.491 gamma(1,.5)[sd]
```