# Low level of covariance simulation

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## Contents



## 1 Motivation

Based on the investigation of the covariance matrix patter of the PCBs from 1999 - 2004, we found some patterns that appears among the covariance matrix of PCBs from differert years. Besides, we also use the historical data to estimate the covariance matrix, then use the sample covariance matrix to decorrelate the PCBs for each year. For most years, the decorrelation procedure can reduce the correlation, e.g 1999-2001, but there are some years which the correlations still are high after decorrelation, e.g 2005-2006.

Since we are trying to borrow information of historical dataset, the decorrelated data will probably not be perfert uncorrelted. In other words, we will end up with data with low correlations among their coveriates. So the goal of this report is to see if the GCTA and EigenPrism method could work well under the low correlation setup.

## 2 setup

### 2.1 Sample covariance matrix

I use two different sample covariane matrices: 1999-2001 and 2007 -2008.

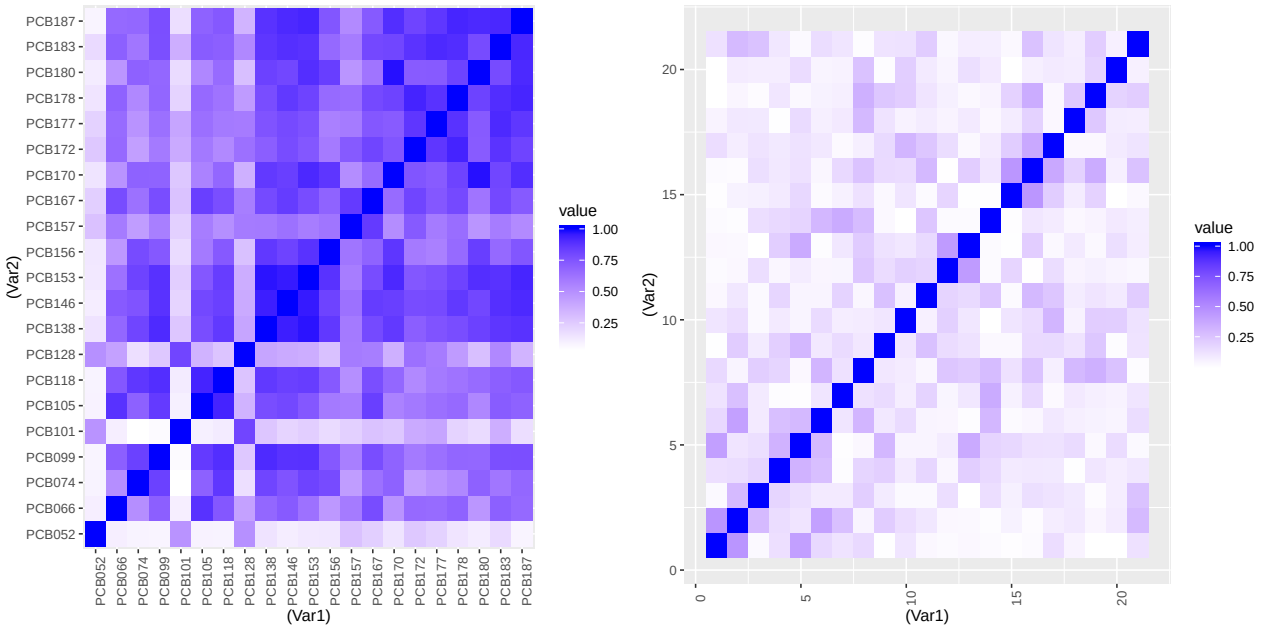



Figure 1: 1999-2000

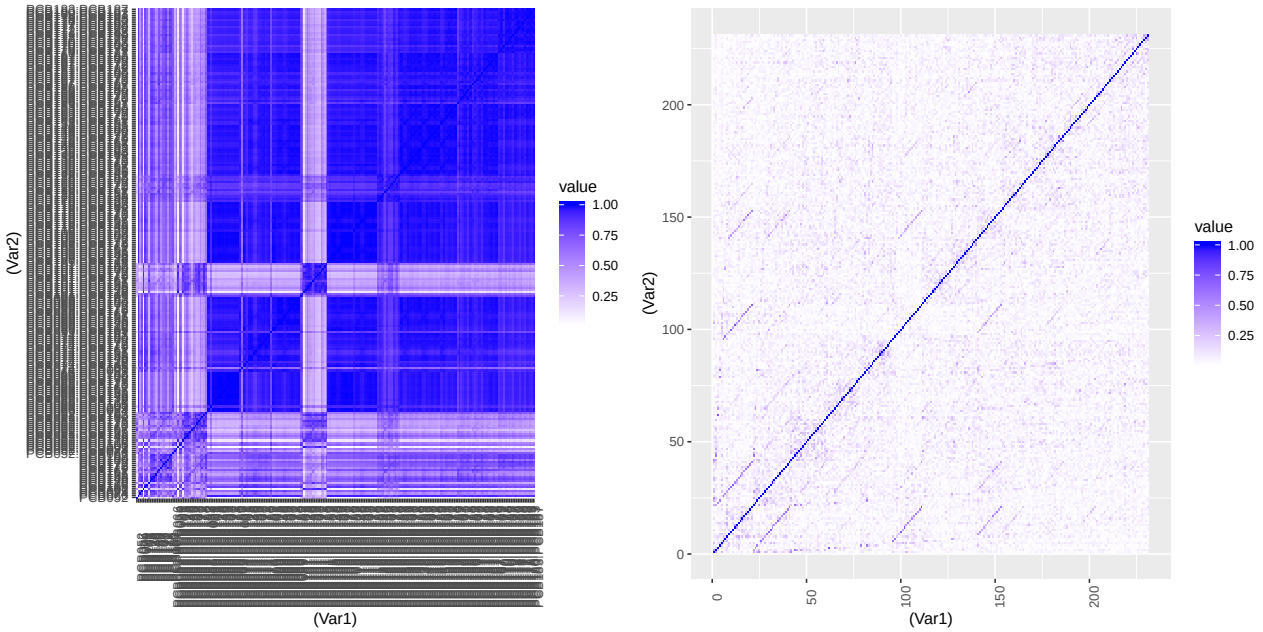
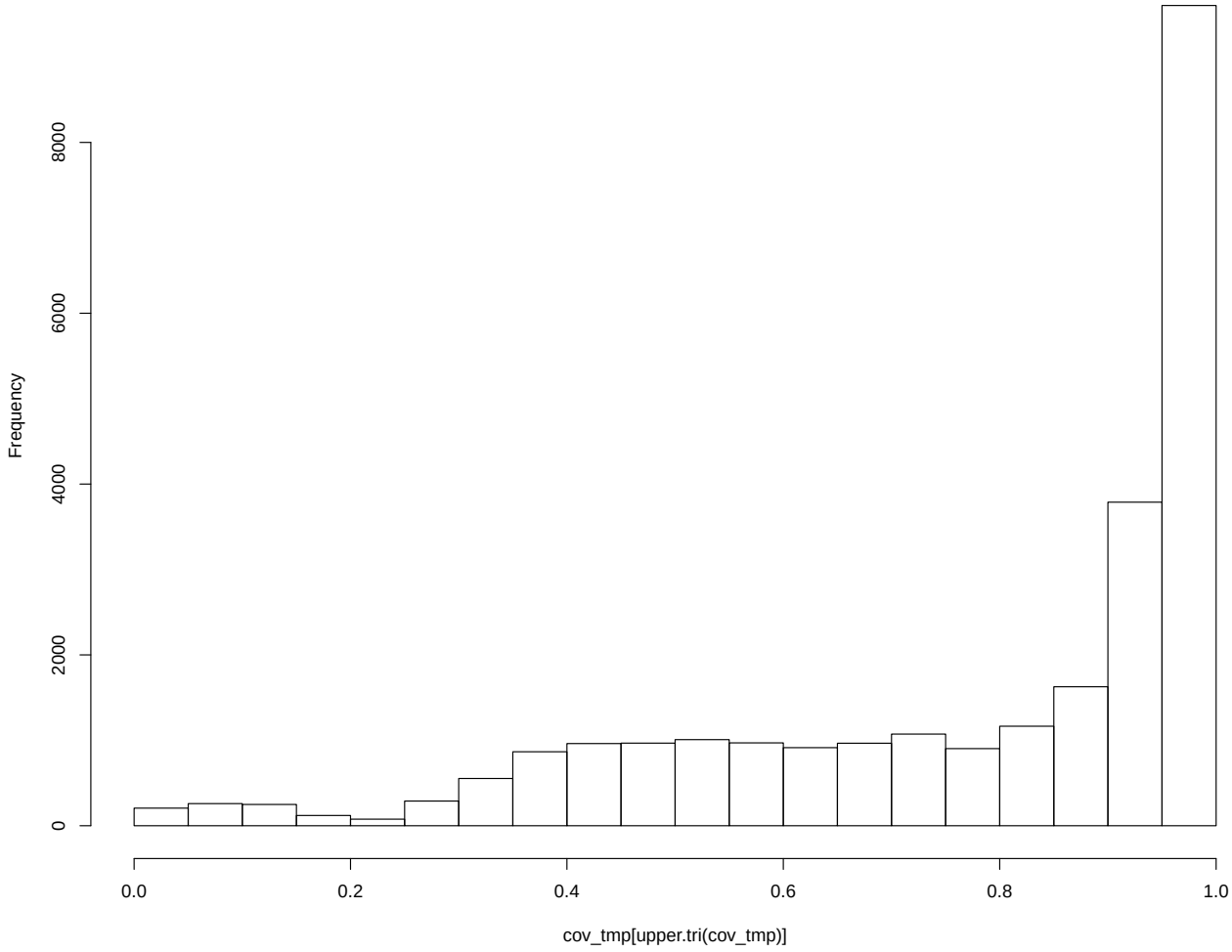
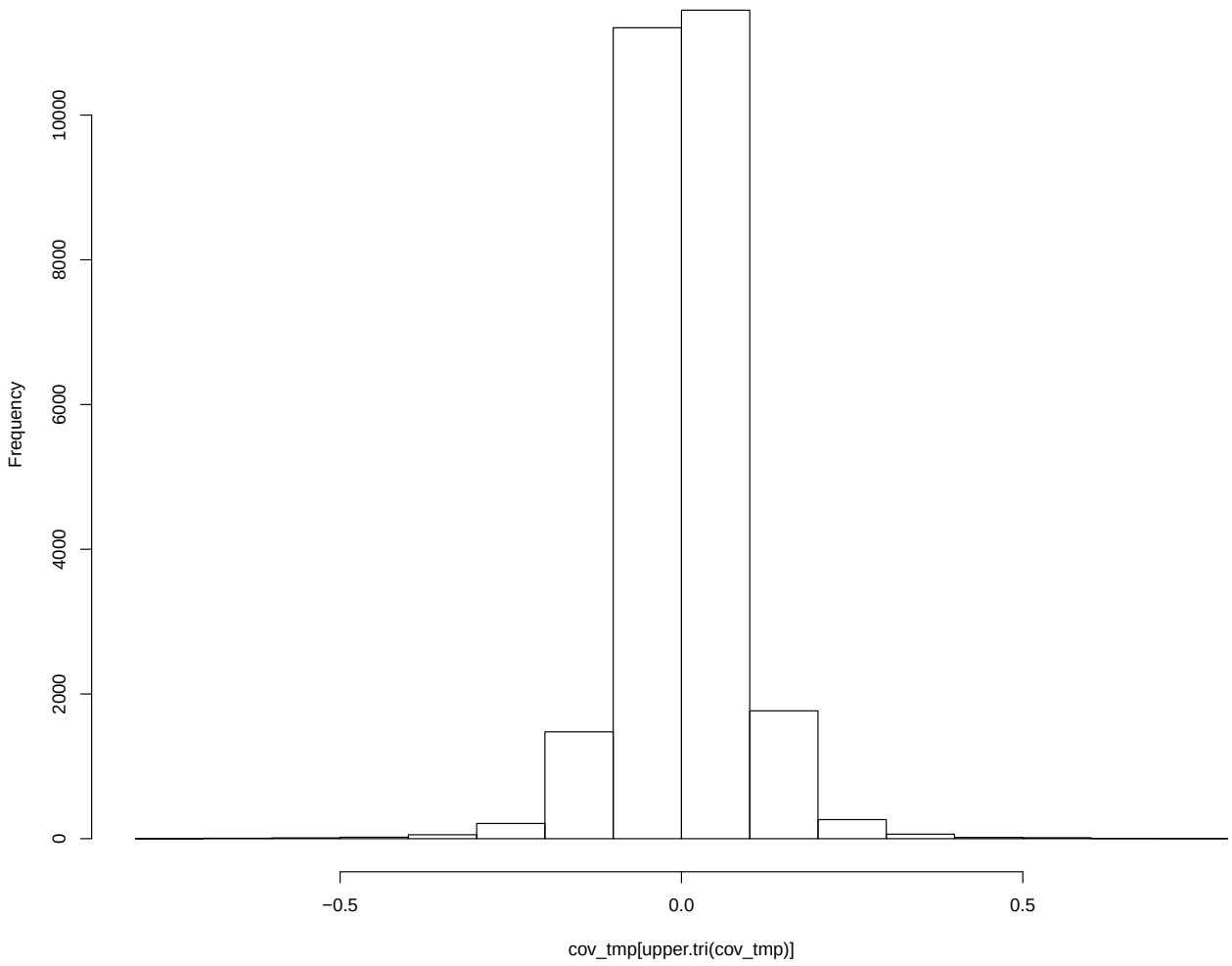



Figure 2: Combined main and interaction 1999-2000


correlation of main and inter
Frequency
0
2000
4000
6000
8000
0.0
0.2
0.4
0.6
0.8
1.0
cov_tmp[upper.tri(cov_tmp)]


decorrelated correlation of main and inter
Frequency
0
2000
4000
6000
8000
10000
−0.5
0.0
0.5
cov_tmp[upper.tri(cov_tmp)]

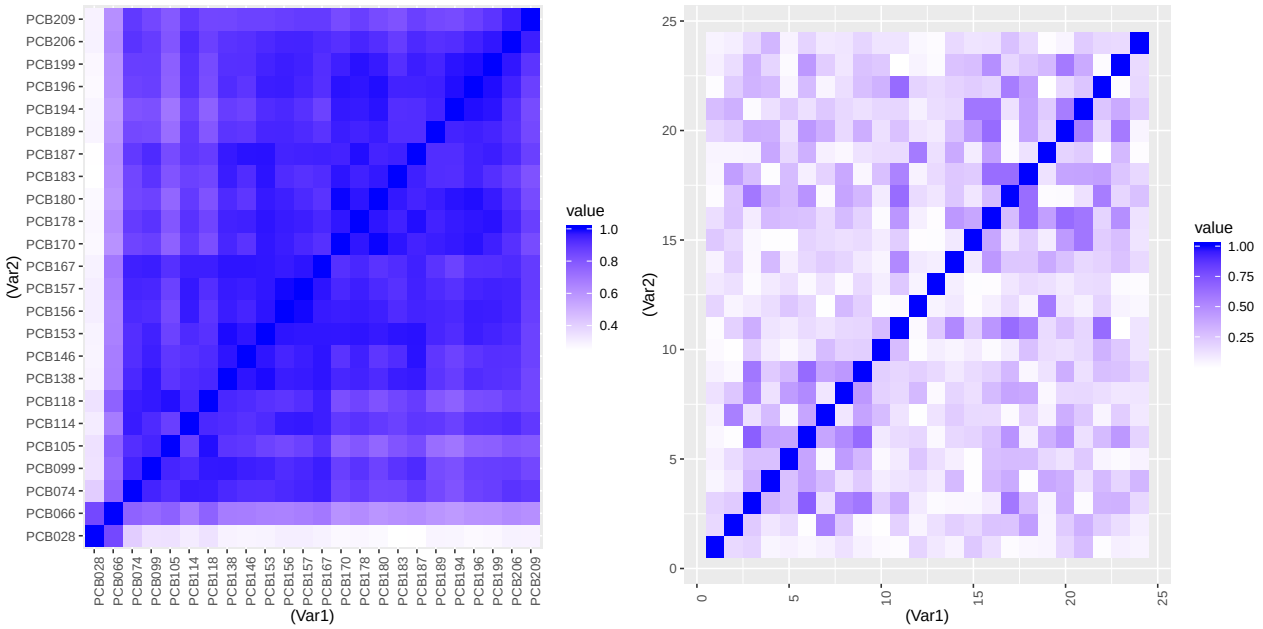



Figure 3: 2005-2006

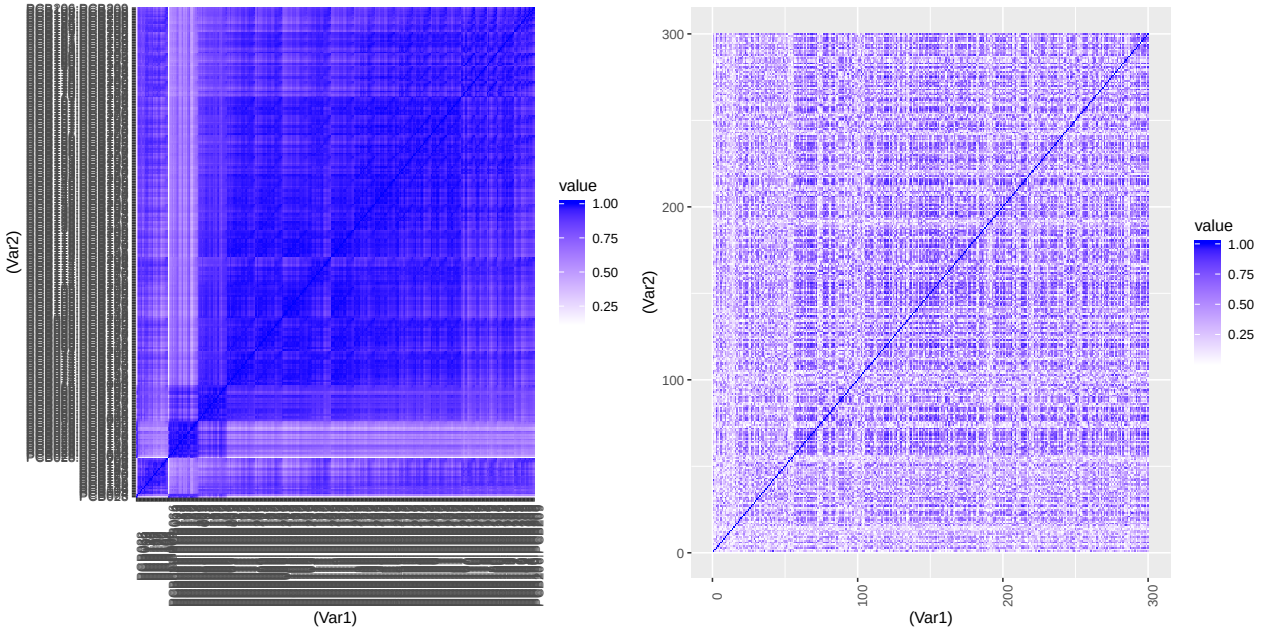
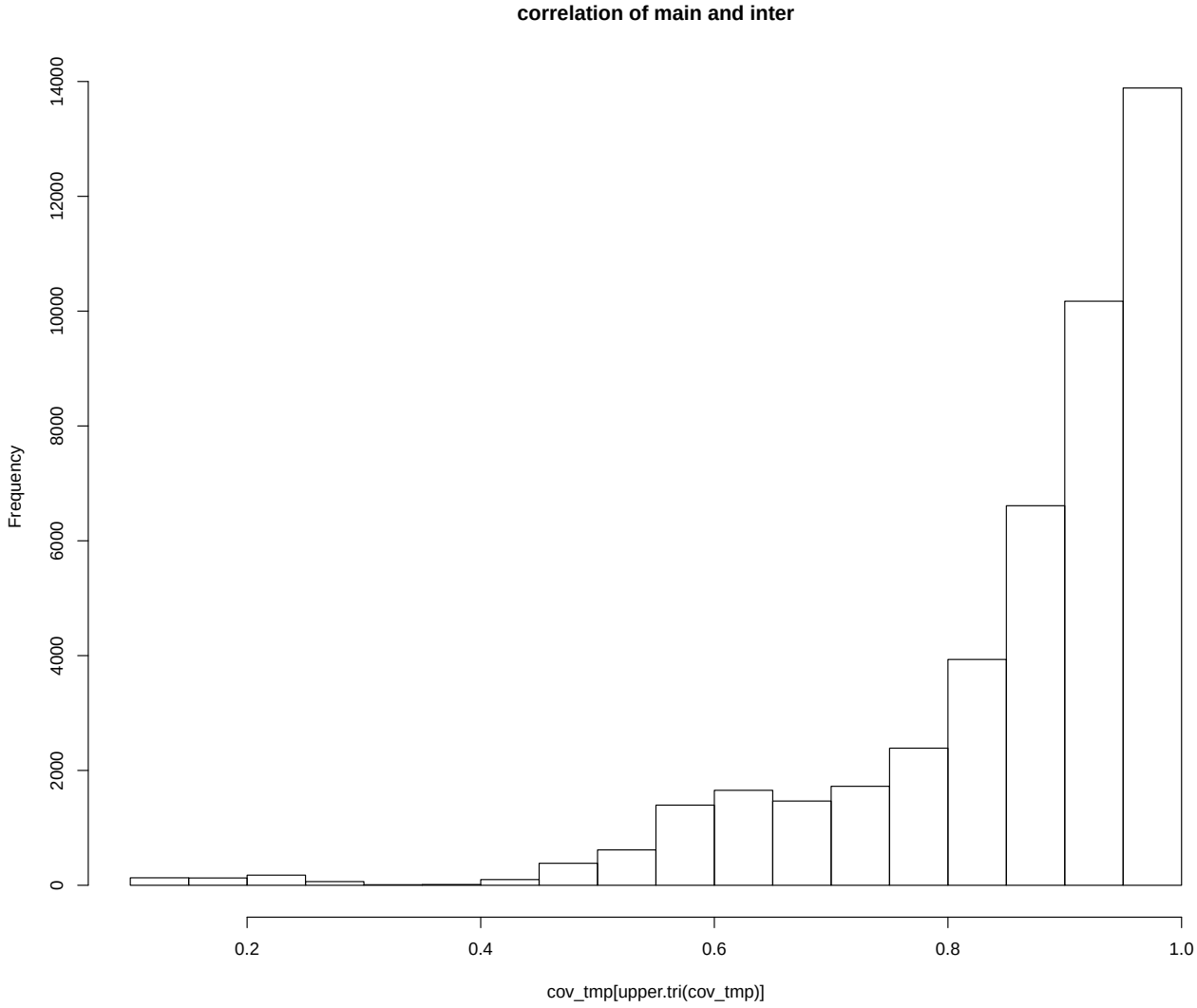
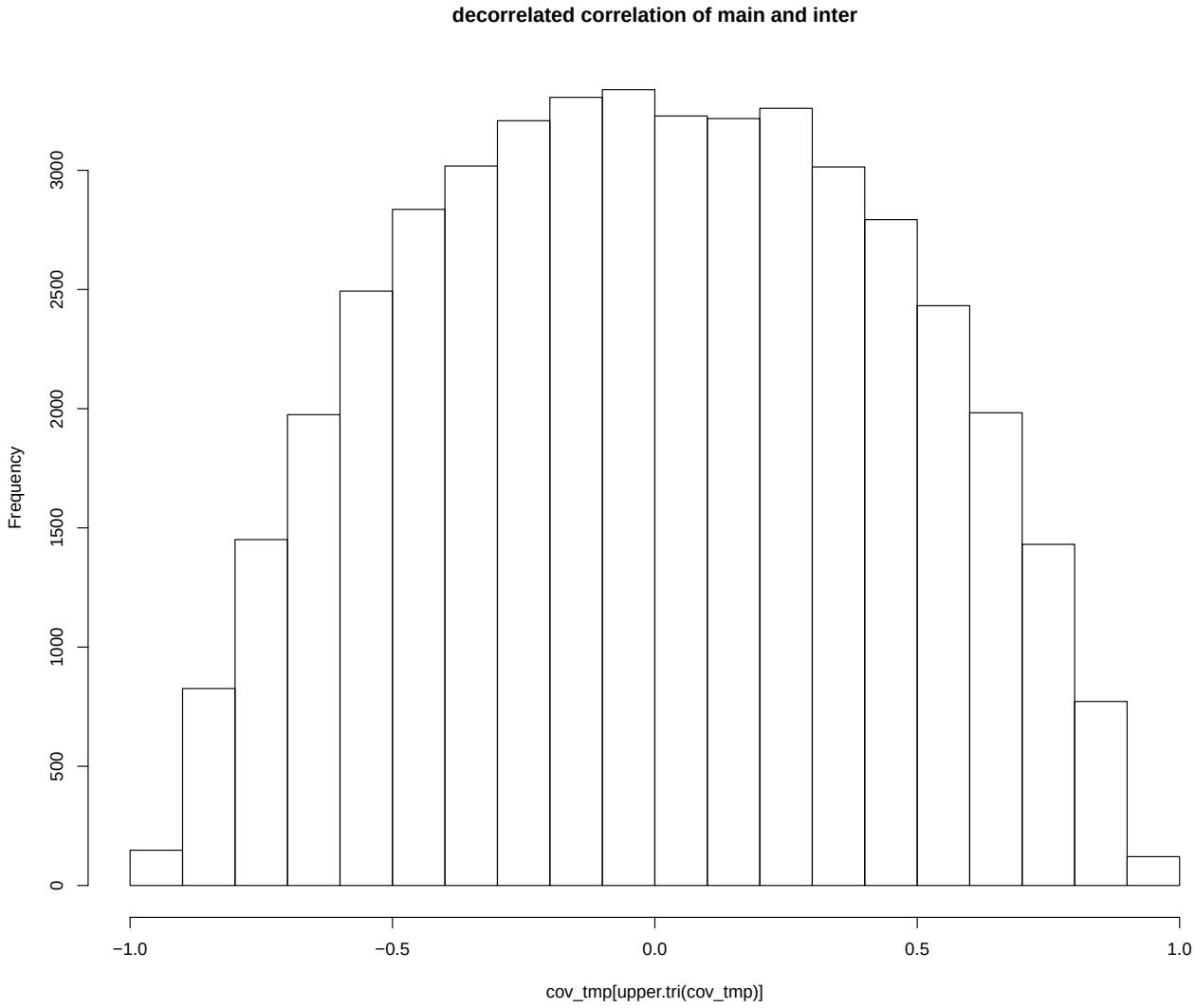



Figure 4: Combined main and interaction 2005-2006


correlation of main and inter
Frequency
0
2000
4000
6000
8000
10000
12000
14000
0.2
0.4
0.6
0.8
1.0
cov_tmp[upper.tri(cov_tmp)]


decorrelated correlation of main and inter
Frequency
0
500
1000
1500
2000
2500
3000
−1.0
−0.5
0.0
0.5
1.0
cov_tmp[upper.tri(cov_tmp)]

### 2.2 Simulation setup

1. p = 231 for 1999 or 300 for 2005
2. $n \in \{100, 150, p\}$
3. the simulated covariates will follow Normal or Chi with df = 1
4. Variance estimation method will be GCTA and EigenPrism method
5. Iteration time is 100

## 3 Result

### 3.1 1999

| | n | MSE | est_var | est_mean | NA_total | method | var_main_effect | x_dist |
|---|---|---|---|---|---|---|---|---|
| 1: | 100 | 626 | 138 | 32 | 9 | EigenPrism | 10 | chi |
| 2: | 150 | 790 | 140 | 36 | 0 | EigenPrism | 10 | chi |
| 3: | 231 | 740 | 61 | 36 | 0 | EigenPrism | 10 | chi |
| 4: | 100 | 852 | 242 | 35 | 0 | GCTA | 10 | chi |
| 5: | 150 | 848 | 191 | 36 | 0 | GCTA | 10 | chi |
| 6: | 231 | 702 | 66 | 35 | 0 | GCTA | 10 | chi |
| 7: | 100 | 504 | 100 | 30 | 4 | EigenPrism | 10 | normal |
| 8: | 150 | 604 | 74 | 33 | 0 | EigenPrism | 10 | normal |
| 9: | 231 | 700 | 70 | 35 | 0 | EigenPrism | 10 | normal |
| 10: | 100 | 649 | 173 | 32 | 0 | GCTA | 10 | normal |
| 11: | 150 | 656 | 99 | 34 | 0 | GCTA | 10 | normal |
| 12: | 231 | 705 | 101 | 35 | 0 | GCTA | 10 | normal |

| | n | MSE | est_var | est_mean | NA_total | method | var_main_effect | x_dist |
|---|---|---|---|---|---|---|---|---|
| 1: | 100 | 16.9 | 16.9 | 9.7 | 0 | EigenPrism | 10 | chi |
| 2: | 150 | 9.4 | 9.5 | 10.0 | 0 | EigenPrism | 10 | chi |
| 3: | 231 | 5.2 | 5.2 | 10.2 | 0 | EigenPrism | 10 | chi |
| 4: | 100 | 19.0 | 18.5 | 9.1 | 0 | GCTA | 10 | chi |
| 5: | 150 | 8.5 | 8.6 | 9.9 | 0 | GCTA | 10 | chi |
| 6: | 231 | 4.8 | 4.9 | 10.1 | 0 | GCTA | 10 | chi |
| 7: | 100 | 19.2 | 19.4 | 9.9 | 0 | EigenPrism | 10 | normal |
| 8: | 150 | 13.3 | 13.2 | 10.5 | 0 | EigenPrism | 10 | normal |
| 9: | 231 | 4.6 | 4.6 | 10.0 | 0 | EigenPrism | 10 | normal |
| 10: | 100 | 22.0 | 22.1 | 9.6 | 0 | GCTA | 10 | normal |
| 11: | 150 | 13.0 | 13.0 | 10.3 | 0 | GCTA | 10 | normal |
| 12: | 231 | 4.1 | 4.1 | 10.0 | 0 | GCTA | 10 | normal |

### 3.2 2005

```
      n  MSE est_var est_mean NA_total     method var_main_effect x_dist
 1: 100  897     132       38        6 EigenPrism              10    chi
 2: 150 1131     140       41        0 EigenPrism              10    chi
 3: 300 1574     109       48       44 EigenPrism              10    chi
 4: 100 1274     287       41        0       GCTA              10    chi
 5: 150 1673     327       47        0       GCTA              10    chi
 6: 300 2090     213       53        0       GCTA              10    chi
 7: 100 1250     173       43        6 EigenPrism              10 normal
 8: 150 1162     129       42        0 EigenPrism              10 normal
 9: 300 1404     104       46       45 EigenPrism              10 normal
10: 100 1789     366       48        0       GCTA              10 normal
11: 150 1570     266       46        0       GCTA              10 normal
12: 300 2069     257       53        0       GCTA              10 normal
```

```
      n  MSE est_var est_mean NA_total     method var_main_effect x_dist
 1: 100 16.4    15.8     10.9        0 EigenPrism              10    chi
 2: 150 13.3    11.6     11.3        0 EigenPrism              10    chi
 3: 300  4.5     4.6      9.9        0 EigenPrism              10    chi
 4: 100 12.3    11.2     11.1        0       GCTA              10    chi
 5: 150 11.0     7.7     11.8        0       GCTA              10    chi
 6: 300  3.7     3.0     10.9        0       GCTA              10    chi
 7: 100 15.1    13.6     11.3        0 EigenPrism              10 normal
 8: 150 11.4    10.6     11.0        0 EigenPrism              10 normal
 9: 300  6.7     6.7     10.3        0 EigenPrism              10 normal
10: 100 12.1    10.2     11.4        0       GCTA              10 normal
11: 150  9.4     7.2     11.5        0       GCTA              10 normal
12: 300  4.4     3.4     11.0        0       GCTA              10 normal
```