

Bioinformatics and Statistical Genetics

Relatedness analysis

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- 1 The file CHD.zip contains genotype information, in the form of PLINK files chd.fam, chd.bed and chd.bim. The files contain genetic information of 109 presumably unrelated individuals of a sample of Chinese in Metropolitan Denver, CO, USA, and corresponds to the CHD sample of the 1,000 Genomes project (www.internationalgenome.org).
- 2 The chd.bed contains the genetic data in binary form. First convert the .bed file to a text file, chd.raw, with the data in (0, 1, 2) format.

```
## [1] "plink --bfile CHD --recodeA --out CHD"
```

- 3 Read the genotype data in (0, 1, 2) format into the R environment. Consult the pedigree information. Are there any documented family relationships for this data set?

Table 1: Data

| FID | IID | PAT | MAT | SEX | PHENOTYPE | rs1110052_T | rs9442373_C |
|---------|---------|-----|-----|-----|-----------|-------------|-------------|
| NA17970 | NA17970 | 0 | 0 | 2 | -9 | 1 | 1 |
| NA17977 | NA17977 | 0 | 0 | 2 | -9 | 1 | 0 |
| NA17981 | NA17981 | 0 | 0 | 2 | -9 | 1 | 0 |
| NA17993 | NA17993 | 0 | 0 | 2 | -9 | 0 | 2 |
| NA18101 | NA18101 | 0 | 0 | 2 | -9 | 1 | 1 |

Table 2: Summary

| FID | IID | PAT | MAT | SEX |
|------------------|------------------|-----------|-----------|---------------|
| Length:109 | Length:109 | Min. :0 | Min. :0 | Min. :1.000 |
| Class :character | Class :character | 1st Qu.:0 | 1st Qu.:0 | 1st Qu.:1.000 |
| Mode :character | Mode :character | Median :0 | Median :0 | Median :2.000 |
| NA | NA | Mean :0 | Mean :0 | Mean :1.541 |
| NA | NA | 3rd Qu.:0 | 3rd Qu.:0 | 3rd Qu.:2.000 |
| NA | NA | Max. :0 | Max. :0 | Max. :2.000 |

In the first column there is the *family Id*, which permits to recognize the family of each individual (different for each one), plus the column mother and father are vectors of zeros, so we don't have relatedness informations.

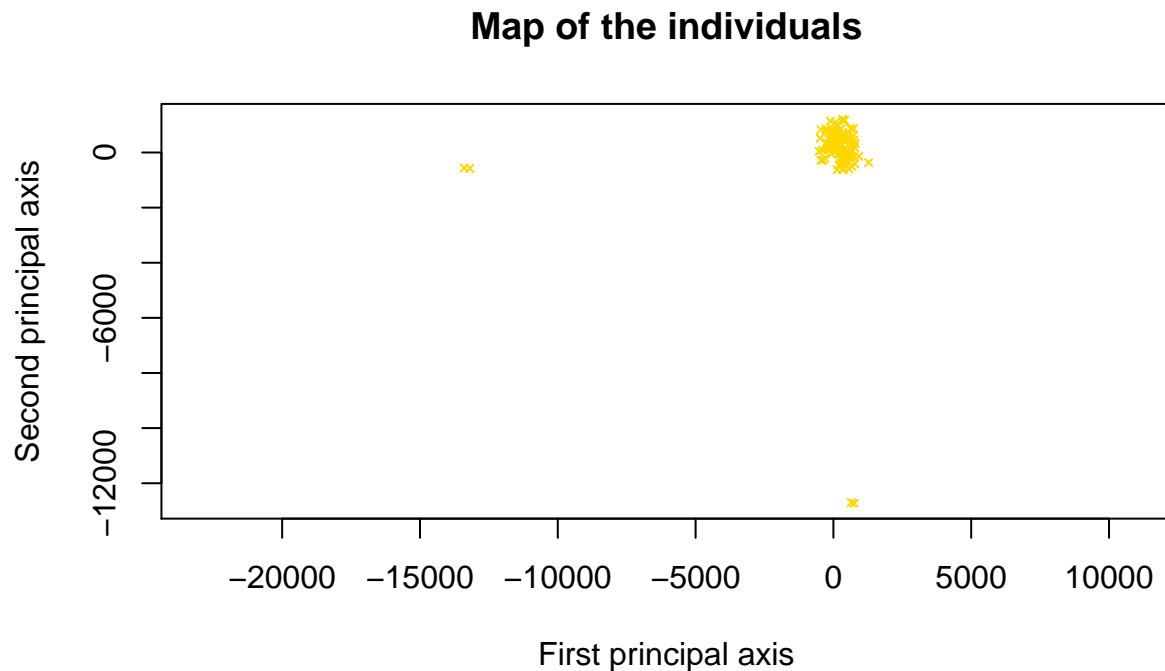
```
## [1] "The number of different families ID is: "
```

```
## [1] 109
```

- 4 Compute the Manhattan distance between the individuals on the basis of the genetic data. Use classical metric multidimensional scaling to obtain a map of the individuals. Are the data homogeneous? Identify possible outliers.

Table 3: Submatrix

| | 1 | 2 | 3 | 4 | 5 |
|-------|-------|-------|-------|-------|---|
| 0 | 21144 | 21251 | 21113 | 21018 | |
| 21144 | 0 | 21231 | 20919 | 21070 | |
| 21251 | 21231 | 0 | 21052 | 21011 | |
| 21113 | 20919 | 21052 | 0 | 21025 | |
| 21018 | 21070 | 21011 | 21025 | 0 | |



After a MDS with $n-1$ dimensions, the great part of the data is homogenous. There are only two small group of outlier of two elements.

```
## [1] "Outliers on the first principal axis:"
```

```
##          3          18
## -13396.10 -13195.59
```

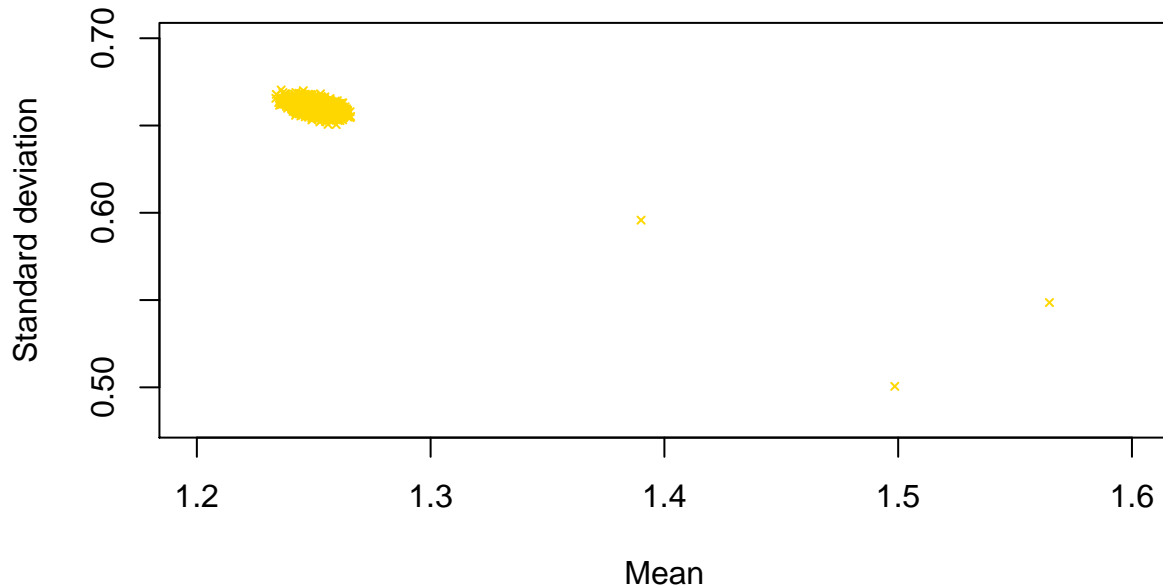
```
## [1] "Outliers on the second principal axis:"
```

```
##          62          89
## -12700.07 -12727.02
```

Table 4: Outliers

| FID | IID | PAT | MAT | SEX | PHENOTYPE |
|---------|---------|-----|-----|-----|-----------|
| NA17981 | NA17981 | 0 | 0 | 2 | -9 |
| NA17986 | NA17986 | 0 | 0 | 1 | -9 |
| NA17976 | NA17976 | 0 | 0 | 1 | -9 |
| NA18116 | NA18116 | 0 | 0 | 2 | -9 |

- 5 Compute the average number of alleles shared between each pair of individuals over all genetic variants. Compute also the corresponding standard deviation. Plot the standard deviation against the mean. Do you think there are any pairs with a close family relationship? How many? Identify the corresponding individuals.



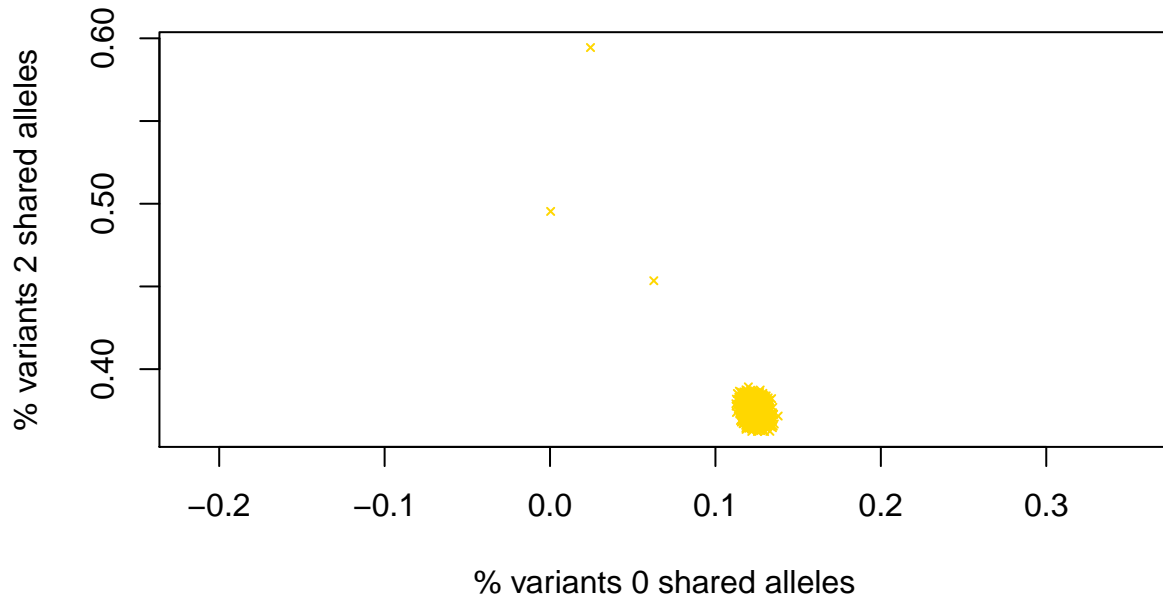
This plot reveals characteristic *clusters* that correspond to the different family relationships. Looking at it, it's possible to see that almost all the individual have not family relationship.

But, if we analyze more in details the plot, there are 3 points with means between 1.4 and 1.6. This means that we have a close family relationship in 3 pairs of individuals. This relationships are probably respectively 2ND, PO and FS (from left to right), because we expect that full siblings are very similar, more than parents-sons, that are more similar than 2nd grade relatives, that are more similar than unrelated couples.

Table 5: Relevant relationship

| | IID1 | IID2 | Mean | Standar Deviation |
|------|---------|---------|--------|-------------------|
| 230 | NA17981 | NA17986 | 1.5647 | 0.5486 |
| 1138 | NA18150 | NA17980 | 1.3900 | 0.5958 |
| 4785 | NA17976 | NA18116 | 1.4985 | 0.5006 |

- 6 Make a plot of the percentage of variants sharing no alleles versus the percentage of variants sharing two alleles for all pairs of individuals. Do you think there are any pairs with a close family relationship? How many? Identify the corresponding individuals.



Here, again, we have a plot that reveals *clusters* that correspond to the different family relationship. The number of clusters and outliers is consistent with the previous case. We have three outliers which are probably FS, PO and 2ND (from top to bottom), with a p_0 almost 0, but an higher p_2 (percentage of marker with 2 IBS alleles) than the big cluster of Unrelated. We added a little bit of jitter in order to avoid overlaps in the big cluster.

Table 6: Relevant relationship

| | IID1 | IID2 | % No shared alleles | % 2 shared alleles |
|------|---------|---------|---------------------|--------------------|
| 230 | NA17981 | NA17986 | 0.0276 | 0.5923 |
| 1138 | NA18150 | NA17980 | 0.0585 | 0.4485 |
| 4785 | NA17976 | NA18116 | 0.0003 | 0.4988 |

7 Can you identify any obvious family relationships between any pairs? Argue your answer.

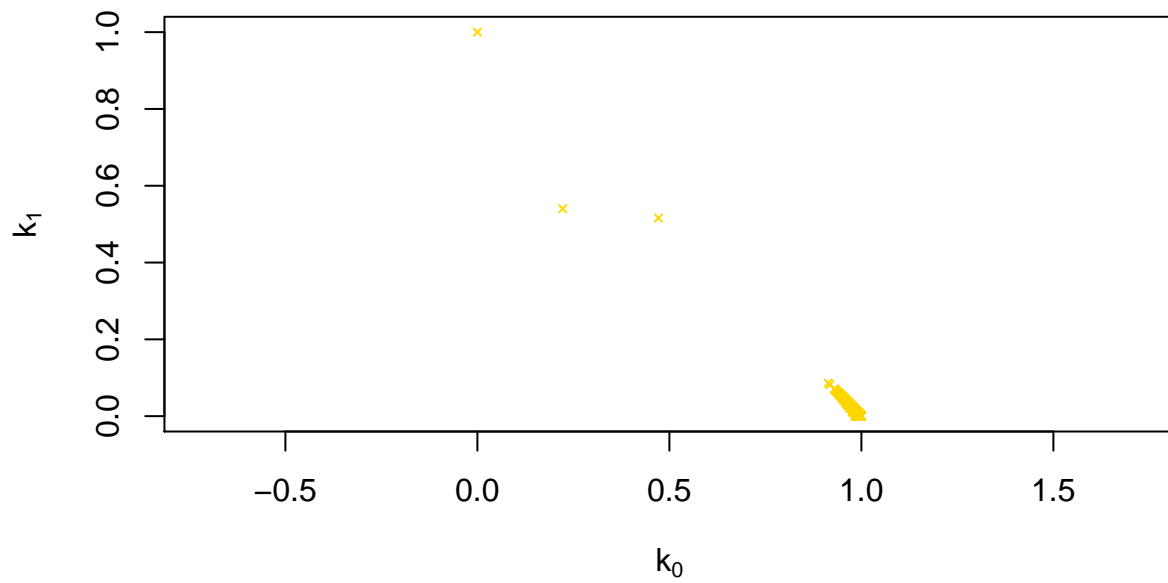
Yes, actually, our previous results are confirmed. The obvious relationships are the same we obtained and explained before.

8 Estimate the *Cotterman coefficients* for all pairs using PLINK. Read the coefficients into the R environment and plot the probability of sharing no IBD alleles against the probability of sharing one IBD allele. Add the theoretical values of the Cotterman coefficients for standard relationships to your plot.

```
## [1] "Running the plink command "
## [1] "plink --bfile CHD --genome --genome-full --out CHD"
## [1] " we obtain a CHD.genome file, which contains all the informations"
## [1] " we need about IBD and Cotterman coefficients."
```

| Relationship | k_0 | k_1 | k_2 | θ |
|--------------|---------------|---------------|---------------|---------------|
| MZ | 0 | 0 | 1 | $\frac{1}{2}$ |
| PO | 0 | 1 | 0 | $\frac{1}{4}$ |
| FS | $\frac{1}{4}$ | $\frac{1}{2}$ | $\frac{1}{4}$ | $\frac{1}{4}$ |
| HS | $\frac{1}{2}$ | $\frac{1}{2}$ | 0 | $\frac{1}{8}$ |
| AV | $\frac{1}{2}$ | $\frac{1}{2}$ | 0 | $\frac{1}{8}$ |
| GG | $\frac{1}{2}$ | $\frac{1}{2}$ | 0 | $\frac{1}{8}$ |
| UN | 1 | 0 | 0 | 0 |

Figure 1: “Cotterman coefficients”



- 9 Make a table of pairs for which you suspect that they have a close family relationship, and list their Cotterman coefficients. State your final conclusions about what relationship these pairs probably have.**

Table 7: Relevant relationship

| | IID1 | IID2 | Z0 | Z1 | Z2 |
|------|---------|---------|--------|--------|--------|
| 230 | NA17981 | NA17986 | 0.2222 | 0.5403 | 0.2376 |
| 1138 | NA18150 | NA17980 | 0.4719 | 0.5160 | 0.0121 |
| 4785 | NA17976 | NA18116 | 0.0000 | 1.0000 | 0.0000 |

The great part of points are UNRELATED, infact they have a k_0 almost to 1. The point with $k_0 = 0.22$ and $k_1 = 0.54$ approximately is an FS. Then we have a point at $k_0 = 0.47$ and $k_1 = 0.51$, that indicates a 2ND degree relationship (HS, AV or GG). Finally, the top left point is a PO with $k_1 = 1$.

These results confirm all what we said in the previous answers.

- 10 Is there any relationship between the MDS map you made and the relationships between the individuals? Report your findings.**

All the four outliers that we found in the MDS map are part of the three relationship couple.

In particular, *NA17981* and *NA17986* both are outlier on the same axis, and from our findings, they are Full Siblings, while *NA17976* and *NA18116* are Parent-Offspring. This make sense according to the analysis we did. Of the three pairs found, two are separated from the big cluster in the MDS, but very close to their relatives.

- 11 Which of the three graphics (m, s) , (p_0, p_2) or (k_0, k_1) do you like best for identifying relationships? Argue your answer.**

First of all, all the three graphics are coerent each other and give us the same results at the end. We think that the first one, (m, s) , is the more intuitive because it's possible to see clearly the clusters and to undestand, thanks to the mean value, their relationship. But, as the Cotterman coefficients are theoretical values, thanks to the third plot we undestood without any doubt which kind of relationship our individuals have.