

sisg-2015-mod23-practical2

sisg23

July 23, 2015

```
setwd("C:/Users/vonholle/Documents/grad_school/misc/training/sisg-2015/module23/sisg-2015-module23") #  
  
data <- read.table("practical_2/data/data.txt", header = T)  
dim(data)
```

```
## [1] 11214    59
```

```
data[1:2, 1:24]
```

```
##      pairID chr1_pi chr2_pi chr3_pi chr4_pi chr5_pi chr6_pi chr7_pi  
## 1 800301112 0.3025 0.4413 0.4603 0.3322 0.4801 0.2045 0.6479  
## 2 801101112 0.5184 0.3173 0.4297 0.6732 0.5803 0.4266 0.3382  
##   chr8_pi chr9_pi chr10_pi chr11_pi chr12_pi chr13_pi chr14_pi chr15_pi  
## 1 0.1674 0.3484 0.4224 0.4550 0.2969 0.5484 0.2646 0.6484  
## 2 0.6611 0.4706 0.3917 0.4542 0.4342 0.3589 0.4113 0.4557  
##   chr16_pi chr17_pi chr18_pi chr19_pi chr20_pi chr21_pi chr22_pi chr_x_pi  
## 1 0.7575 0.5294 0.7745 0.6430 0.6818 0.8810 0.5376 0.4681  
## 2 0.7145 0.6257 0.6315 0.8907 0.6510 0.3921 0.4344 0.7597
```

```
# Investigate the pi_hat_d values for the autosomes and X chromosome  
data[1:2, 25:47]
```

```
##   chr1_ibd chr2_ibd chr3_ibd chr4_ibd chr5_ibd chr6_ibd chr7_ibd chr8_ibd  
## 1 0.0146 0.1576 0.1428 0.0201 0.2047 0.0102 0.4009 0.0318  
## 2 0.1987 0.0300 0.1771 0.5068 0.3305 0.1260 0.0731 0.4637  
##   chr9_ibd chr10_ibd chr11_ibd chr12_ibd chr13_ibd chr14_ibd chr15_ibd  
## 1 0.0458 0.1916 0.1324 0.1090 0.4508 0.0107 0.3754  
## 2 0.2977 0.1373 0.2333 0.1679 0.0037 0.0597 0.3768  
##   chr16_ibd chr17_ibd chr18_ibd chr19_ibd chr20_ibd chr21_ibd chr22_ibd  
## 1 0.5247 0.2466 0.5560 0.3028 0.3735 0.7689 0.1238  
## 2 0.4518 0.3782 0.3355 0.7852 0.3151 0.0176 0.0309  
##   chr_x_ibd  
## 1 0.4681  
## 2 0.7597
```

```
# Take a look at the rest of the data matrix  
data[1:2, 48:59]
```

```
##      gw_pi gw_ibd sex_sib1 age_sib1 ht_sib1 zht_sib1 sex_sib2  
## 1 0.4920500 0.2361227      1      16 178.0 0.47048173      1  
## 2 0.5118773 0.2498455      1      16 174.5 -0.05328332      1  
##   age_sib2 ht_sib2 zht_sib2 sex_pair pop  
## 1      16     166 -1.325284      1  2  
## 2      16     185 1.518012      1  2
```

Exercise 1

Calculate the sample mean and SD of $\hat{\pi}_a$ and $\hat{\pi}_d$:

- for each autosome
- genome-wide
- Do a histogram of the genome-wide $\hat{\pi}_a$ and $\hat{\pi}_d$ (row means) and compare the mean and standard to that in the lectures.
- plot genome-wide $\hat{\pi}_a$ against $\hat{\pi}_d$ for each sibling pair.
- regress genome-wide $\hat{\pi}_d$ values on genome-wide $\hat{\pi}_a$.

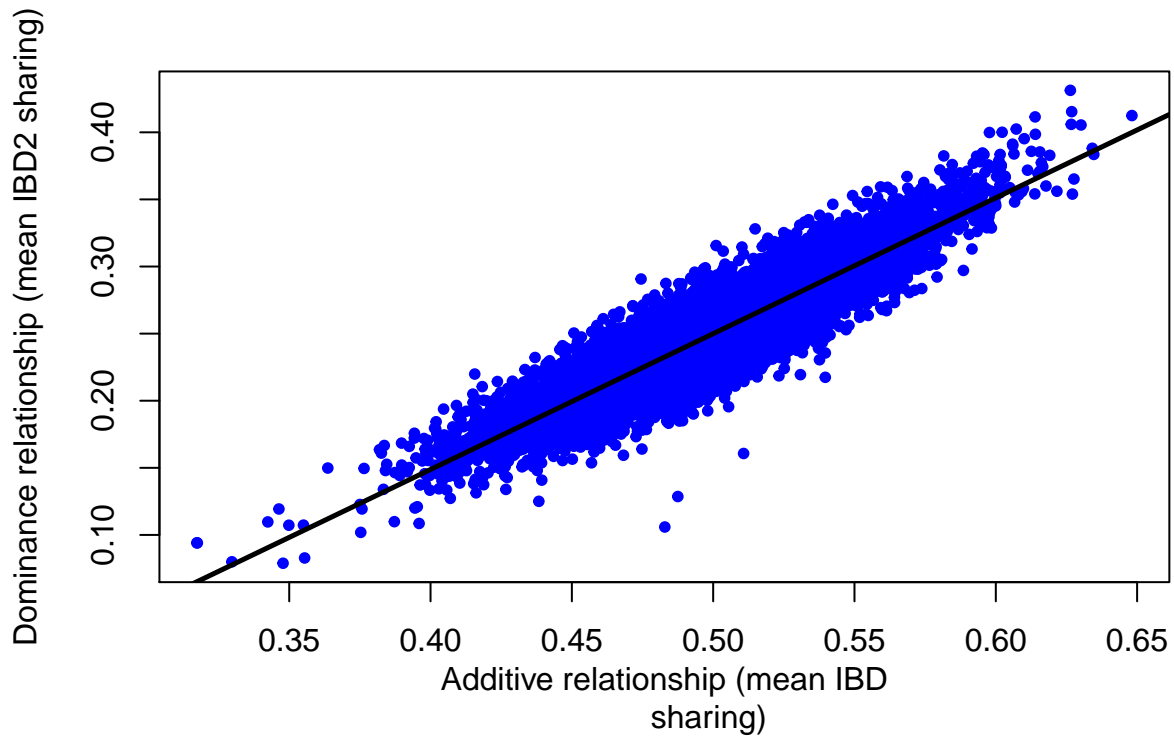
```
# Row means over a matrix can be calculated with the below function  
rowMeans(data[1:2, 2:23])
```

```
##           1           2  
## 0.4920500 0.5118773
```

```
# A similar function does not exist for row standard deviations and thus we  
# must appeal to the apply function  
head(apply(data[, 2:23], 1, sd))
```

```
## [1] 0.1934229 0.1461863 0.1777696 0.1620989 0.1846666 0.1840230
```

```
pihat.mean <- rowMeans(data[, 2:23])  
pihat.sd <- apply(data[, 2:23], 1, sd)  
ibd.mean <- rowMeans(data[, 25:46])  
ibd.sd <- apply(data[, 25:46], 1, sd)  
plot(pihat.mean, ibd.mean, pch = 20,  
     col = 4, ylab = "Dominance relationship (mean IBD2 sharing)", xlab = "Additive relationship (mean IBD  
                        sharing)")  
# Regress IBD2 on pi-hat. Use the lm function in R. Try ?lm if you are interested  
reg <- lm(ibd.mean ~ pihat.mean)  
abline(reg, lwd = 2.5)
```



```
# Regress IBD on pi-hat. Use the lm function un R. Try ?lm if you are interested
summary(lm(ibd.mean ~ pihat.mean))
```

```
##
## Call:
## lm(formula = ibd.mean ~ pihat.mean)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.126745 -0.011290  0.000044  0.011251  0.066568
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) -0.256023   0.002184  -117.2   <2e-16 ***
## pihat.mean   1.011945   0.004362   232.0   <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.01709 on 11212 degrees of freedom
## Multiple R-squared:  0.8276, Adjusted R-squared:  0.8276
## F-statistic: 5.382e+04 on 1 and 11212 DF,  p-value: < 2.2e-16
```

```
# Read in .ped and .dat files
setwd("C:/Users/vonholle/Documents/grad_school/misc/training/sisg-2015/module23/sisg-2015-module23") #
ped <- read.table("practical_2/data/qtdt.ped")
```

```
dat <- read.table("practical_2/data/qtdt.dat")
ibd <- read.table("practical_2/data/qtdt.ibd")
```

```
# The head of the .ped file. Two columns have been cut to fit in the listing
head(ped)
```

```
##      V1 V2 V3 V4 V5      V6 V7  V8  V9 V10 V11 V12 V13 V14 V15 V16 V17 V18
## 1   1  1  0  0  1      X  X   X 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
## 2   1  2  0  0  2      X  X   X 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
## 3   1  3  1  2  1  0.4705 1 16. 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1
## 4   1  4  1  2  1 -1.3253 1 16. 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2
## 5   2  1  0  0  1      X  X   X 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
## 6   2  2  0  0  2      X  X   X 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
##      V19 V20 V21 V22 V23 V24 V25 V26 V27 V28 V29 V30 V31
## 1 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
## 2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
## 3 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1 1/1
## 4 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2 2/2
## 5 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
## 6 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2 1/2
```

```
dat
```

```
##      V1  V2
## 1     T   Y
## 2     C SEX
## 3     C AGE
## 4    S2  C1
## 5    S2  C2
## 6    S2  C3
## 7    S2  C4
## 8    S2  C5
## 9    S2  C6
## 10   S2  C7
## 11   S2  C8
## 12   S2  C9
## 13   S2 C10
## 14   S2 C11
## 15   S2 C12
## 16   S2 C13
## 17   S2 C14
## 18   S2 C15
## 19   S2 C16
## 20   S2 C17
## 21   S2 C18
## 22   S2 C19
## 23   S2 C20
## 24   S2 C21
## 25   S2 C22
## 26    M   G
```

```
head(ibd)
```

```
##      V1 V2 V3 V4      V5      V6      V7
## 1    1  3  4 C1 0.4096 0.5758 0.0146
## 2    1  3  4 C2 0.2750 0.5674 0.1576
## 3    1  3  4 C3 0.2222 0.6350 0.1428
## 4    1  3  4 C4 0.3557 0.6242 0.0201
## 5    1  3  4 C5 0.2445 0.5508 0.2047
## 6    1  3  4 C6 0.6012 0.3886 0.0102
```

```
ibd[1:23,1:ncol(ibd)]
```

```
##      V1 V2 V3 V4      V5      V6      V7
## 1    1  3  4 C1 0.4096 0.5758 0.0146
## 2    1  3  4 C2 0.2750 0.5674 0.1576
## 3    1  3  4 C3 0.2222 0.6350 0.1428
## 4    1  3  4 C4 0.3557 0.6242 0.0201
## 5    1  3  4 C5 0.2445 0.5508 0.2047
## 6    1  3  4 C6 0.6012 0.3886 0.0102
## 7    1  3  4 C7 0.1051 0.4940 0.4009
## 8    1  3  4 C8 0.6970 0.2712 0.0318
## 9    1  3  4 C9 0.3490 0.6052 0.0458
## 10   1  3  4 C10 0.3468 0.4616 0.1916
## 11   1  3  4 C11 0.2224 0.6452 0.1324
## 12   1  3  4 C12 0.5152 0.3758 0.1090
## 13   1  3  4 C13 0.3540 0.1952 0.4508
## 14   1  3  4 C14 0.4815 0.5078 0.0107
## 15   1  3  4 C15 0.0786 0.5460 0.3754
## 16   1  3  4 C16 0.0097 0.4656 0.5247
## 17   1  3  4 C17 0.1878 0.5656 0.2466
## 18   1  3  4 C18 0.0070 0.4370 0.5560
## 19   1  3  4 C19 0.0168 0.6804 0.3028
## 20   1  3  4 C20 0.0099 0.6166 0.3735
## 21   1  3  4 C21 0.0069 0.2242 0.7689
## 22   1  3  4 C22 0.0486 0.8276 0.1238
## 23   1  3  4  G 0.2520 0.5119 0.2361
```

```
# following lines from a document from ibg.colorado.edu/~howrigan/howrigan/.../Howrigan_WCPG_2010.pdf
# THE 'system()' COMMAND:
# #The system command is a way to use your computer terminal from within R. Within the system() function
# whatever you put in quotes will be read as if that's what you typed in your terminal window. I'm doing
# my analyses using a UNIX shell (bash), and so in order to use the qtdt program, I have to put a './'
# before I write 'qtdt'. Windows users only need to write 'qtdt'. In addition, I use 'intern=TRUE' so that
# the output will be displayed in the R console.
# #NOTE: this won't look as good in R as in terminal unless you have your width setup accordingly
options(width=100) #works well
```

Original run from the assignment

```
setwd("C:/Users/vonholle/Documents/grad_school/misc/training/sisg-2015/module23/sisg-2015-module23") #
# Let's see if these files will work in QTDT
# Once you've set up your binary directory for this analysis and have set R to that directory, do this:
system("qtdt -d practical_2/data/qtdt.dat -p practical_2/data/qtdt.ped -a- -we- -veg-", intern=TRUE)
```

```
## [1] "QTDT - Quantitative TDT 2.6.1"
## [2] "(c) 1998-2007 Goncalo Abecasis (goncalo@umich.edu)"
## [3] ""
## [4] "This program implements tests described by"
## [5] "Abecasis et al, Am J Hum Genet 66:279-292 (2000)"
## [6] "Abecasis et al, Eur J Hum Genet 8:545-551 (2000)"
## [7] "and others"
## [8] ""
## [9] "The following parameters are in effect:"
## [10] "      QTDT Data File : practical_2/data/qtdt.dat (-dname)"
## [11] "      QTDT Pedigree File : practical_2/data/qtdt.ped (-pname)"
## [12] "      QTDT IBD Status File :          qtdt.ibd (-iname)"
## [13] "      Missing Value Code :          -99.999 (-xname)"
## [14] "      Covariates :          USER SPECIFIED (-c{p|s|u|-})"
## [15] "      Association Model :          NONE (-a[a|d|f|m|o|p|r|t|w|-])"
## [16] "      Full Model Variances :          NON SHARED (-v{e|c|g|n|t|a|d|-})"
## [17] "      &          POLYGENIC"
## [18] "      Null Model Variances :          NON SHARED (-w{e|c|g|n|t|a|d|-})"
## [19] "      Parent of Origin Effects :          NONE (-o[f|t|m|p|-])"
## [20] "      Monte-Carlo Permutations :          0 (-m9999)"
## [21] "      Random Seed :          123456 (-r9999)"
## [22] "      Numeric Minimizer :          NELDER AND MEAD (-n[f|n|p])"
## [23] "      Transmission Scoring :          FULL PEDIGREE (-t[n|p])"
## [24] ""
## [25] "Additional Options"
## [26] "  --dominance, --snp, --multi-allelic, --deviates, --references,"
## [27] "  --exclude-founder-phenotypes, --p-values, --no-regress-tbl"
## [28] ""
## [29] "Online documentation http://www.sph.umich.edu/csg/abecasis/QTDT"
## [30] "Comments, bugs: goncalo@umich.edu"
## [31] ""
## [32] "The following models will be evaluated..."
## [33] "  NULL MODEL"
## [34] "      Means = Mu + SEX + AGE"
## [35] "      Variances = Ve"
## [36] ""
## [37] "  FULL MODEL"
## [38] "      Means = Mu + SEX + AGE"
## [39] "      Variances = Ve + Vg"
## [40] ""
## [41] "Testing trait:          Y"
## [42] "=====
## [43] ""
## [44] " Allele    df(0) -LnLk(0)    df(V) -LnLk(V)    ChiSq          p"
## [45] "      N/A    22424 31521.42    22423 30196.57 2649.70 0e+000 (22428 probands)"
## [46] ""
## [47] ""
## [48] "Run completed on Thu Jul 23 13:49:05 2015"
```

```

## [49] "1 tests carried out"
## [50] ""
## [51] "The most significant result refers to:"
## [52] "    Trait: Y"
## [53] "    ChiSq: 2649.700"
## [54] "    p-value: 0e+000"
## [55] ""
## [56] ""

system("qtdt -d practical_2/data/qtdt.dat -p practical_2/data/qtdt.ped -i practical_2/data/qtdt.ibd -a-

## [1] "QTD T - Quantitative TDT 2.6.1"
## [2] "(c) 1998-2007 Goncalo Abecasis (goncalo@umich.edu)"
## [3] ""
## [4] "This program implements tests described by"
## [5] "Abecasis et al, Am J Hum Genet 66:279-292 (2000)"
## [6] "Abecasis et al, Eur J Hum Genet 8:545-551 (2000)"
## [7] "and others"
## [8] ""
## [9] "The following parameters are in effect:"
## [10] "    QTD T Data File : practical_2/data/qtdt.dat (-dname)"
## [11] "    QTD T Pedigree File : practical_2/data/qtdt.ped (-pname)"
## [12] "    QTD T IBD Status File : practical_2/data/qtdt.ibd (-iname)"
## [13] "    Missing Value Code :          -99.999 (-xname)"
## [14] "    Covariates :          USER SPECIFIED (-c{p|s|u|-})"
## [15] "    Association Model :          NONE (-a[a|d|f|m|o|p|r|t|w|-])"
## [16] "    Full Model Variances :          NON SHARED (-v{e|c|g|n|t|a|d|-})"
## [17] "    &          POLYGENIC"
## [18] "    &          ADDITIVE"
## [19] "    Null Model Variances :          NON SHARED (-w{e|c|g|n|t|a|d|-})"
## [20] "    &          POLYGENIC"
## [21] "    Parent of Origin Effects :          NONE (-o[f|t|m|p|-])"
## [22] "    Monte-Carlo Permutations :          0 (-m9999)"
## [23] "    Random Seed :          123456 (-r9999)"
## [24] "    Numeric Minimizer :          NELDER AND MEAD (-n[f|n|p])"
## [25] "    Transmission Scoring :          FULL PEDIGREE (-t[n|p])"
## [26] ""
## [27] "Additional Options"
## [28] " --dominance, --snp, --multi-allelic, --deviates, --references,"
## [29] " --exclude-founder-phenotypes, --p-values, --no-regress-tbl"
## [30] ""
## [31] "Online documentation http://www.sph.umich.edu/csg/abecasis/QTD T"
## [32] "Comments, bugs: goncalo@umich.edu"
## [33] ""
## [34] "The following models will be evaluated..."
## [35] "    NULL MODEL"
## [36] "    Means = Mu + SEX + AGE"
## [37] "    Variances = Ve + Vg"
## [38] ""
## [39] "    FULL MODEL"
## [40] "    Means = Mu + SEX + AGE"
## [41] "    Variances = Ve + Vg + Va"
## [42] ""
## [43] "Testing trait:          Y"

```

```
## [44] "=====
## [45] ""
## [46] "Testing marker:                G"
## [47] "-----"
## [48] ""
## [49] " Allele    df(0) -LnLk(0)    df(V) -LnLk(V)    ChiSq        p"
## [50] "      All    22423 30196.57    22422 30186.27    20.61    6e-006    (22428 probands)"
## [51] ""
## [52] ""
## [53] "Run completed on Thu Jul 23 13:49:40 2015"
## [54] "1 tests carried out"
## [55] ""
## [56] "The most significant result refers to:"
## [57] "      Trait: Y"
## [58] "      Marker: G"
## [59] "      ChiSq: 20.609"
## [60] "      p-value: 6e-006"
## [61] ""
## [62] "Overall Bonferroni significance level: 6e-006"
## [63] ""
```

Run on the 10th chromosome.

```
setwd("C:/Users/vonholle/Documents/grad_school/misc/training/sisg-2015/module23/sisg-2015-module23") #
# marker 10
system("qtdt -d practical_2/data/qtdt10.dat -p practical_2/data/qtdt.ped -i practical_2/data/qtdt.ibd -
```

Note: no variance showing up.

```
## [1] "QTD T - Quantitative TDT 2.6.1"
## [2] "(c) 1998-2007 Goncalo Abecasis (goncalo@umich.edu)"
## [3] ""
## [4] "This program implements tests described by"
## [5] "Abecasis et al, Am J Hum Genet 66:279-292 (2000)"
## [6] "Abecasis et al, Eur J Hum Genet 8:545-551 (2000)"
## [7] "and others"
## [8] ""
## [9] "The following parameters are in effect:"
## [10] "      QTD T Data File : practical_2/data/qtdt10.dat (-dname)"
## [11] "      QTD T Pedigree File : practical_2/data/qtdt.ped (-pname)"
## [12] "      QTD T IBD Status File : practical_2/data/qtdt.ibd (-iname)"
## [13] "      Missing Value Code :                -99.999 (-xname)"
## [14] "      Covariates :                USER SPECIFIED (-c{p|s|u|-})"
## [15] "      Association Model :                NONE (-a[a|d|f|m|o|p|r|t|w|-])"
## [16] "      Full Model Variances :                NON SHARED (-v{e|c|g|n|t|a|d|-})"
## [17] "      &                POLYGENIC"
## [18] "      &                ADDITIVE"
## [19] "      Null Model Variances :                NON SHARED (-w{e|c|g|n|t|a|d|-})"
## [20] "      &                POLYGENIC"
## [21] "      Parent of Origin Effects :                NONE (-o[f|t|m|p|-])"
## [22] "      Monte-Carlo Permutations :                0 (-m9999)"
```



```

## [23] "          Random Seed :          123456 (-r9999)"
## [24] "          Numeric Minimizer :      NELDER AND MEAD (-n[f|n|p])"
## [25] "          Transmission Scoring :    FULL PEDIGREE (-t[n|p])"
## [26] ""
## [27] "Additional Options"
## [28] " --dominance, --snp, --multi-allelic, --deviates, --references,"
## [29] " --exclude-founder-phenotypes, --p-values, --no-regress-tbl"
## [30] ""
## [31] "Online documentation http://www.sph.umich.edu/csg/abecasis/QTDT"
## [32] "Comments, bugs: goncalo@umich.edu"
## [33] ""
## [34] "The following models will be evaluated..."
## [35] "  NULL MODEL"
## [36] "      Means = Mu + SEX + AGE"
## [37] " Variances = Ve + Vg"
## [38] ""
## [39] "  FULL MODEL"
## [40] "      Means = Mu + SEX + AGE"
## [41] " Variances = Ve + Vg + Va"
## [42] ""
## [43] "Testing trait:                      Y"
## [44] "===== "
## [45] ""
## [46] "Testing marker:                     C10"
## [47] "----- "
## [48] ""
## [49] " Allele    df(0) -LnLk(0)    df(V) -LnLk(V)    ChiSq      p"
## [50] "      All    22423 30196.57    22422 30196.57     0.00      (22428 probands)"
## [51] ""
## [52] ""
## [53] "Run completed on Thu Jul 23 13:50:28 2015"
## [54] "1 tests carried out"
## [55] ""
## [56] "The most significant result refers to:"
## [57] "   Trait: Y"
## [58] "   Marker: C10"
## [59] "   ChiSq: 0.000"
## [60] "   p-value: 1.0000"
## [61] ""
## [62] ""

```

Appendix

```
sessionInfo()
```

```

## R version 3.2.1 (2015-06-18)
## Platform: x86_64-w64-mingw32/x64 (64-bit)
## Running under: Windows 8 x64 (build 9200)
##
## locale:
## [1] LC_COLLATE=English_United States.1252  LC_CTYPE=English_United States.1252
## [3] LC_MONETARY=English_United States.1252 LC_NUMERIC=C

```

```
## [5] LC_TIME=English_United States.1252
##
## attached base packages:
## [1] stats      graphics  grDevices  utils      datasets  methods   base
##
## loaded via a namespace (and not attached):
## [1] magrittr_1.5      tools_3.2.1      htmltools_0.2.6  yaml_2.1.13      stringi_0.5-5     rmarkdown_0.7
## [7] knitr_1.10.5      stringr_1.0.0     digest_0.6.8     evaluate_0.7
```

```
getwd()
```

```
## [1] "C:/Users/vonholle/Documents/grad_school/misc/training/sisg-2015/module23/sisg-2015-module23/prac"
```