## 1 Overview

Start R Your first task is to start R. Simple?
Run a command Try to run the following command:
$>2+2$
[1] 4
Now try to edit the command - use the arrow keys
Create a data set Create the following data vectors: The even numbers 2 through 20 stored as evens; The prime numbers from 2 through 29 stored as primes.

Apply a function to the data set For the evens data set find the mean and variance. For the primes data set find the median and IQR.

For the evens data set what is done by cumsum(evens)?
Look up help on a function The mean function has an option for trimming. Read the manual page and compute the $10 \%$ trimmed mean for the primes.

Load a built-in data set Load the built-in data set rivers. Call the stem function on the data set. Is the data set skewed?

Install and load an external package Install and load the UsingR data set. For its babies data set answer the following:

1. How many variables are there? What types are they? What are there names? How many subjects are there?
2. Find numeric summaries of the weight of the baby (wt). Do a stem and leaf plot to see if there are any outliers, if so find the trimmed mean ( $10 \%$ ).
3. Repeat for the Mother's weight wt1.

Find graphical summaries of a data set Again for the babies data set: Find a histogram of wt and wt1.

Make a density plot of the ht variable.

Make a boxplot of the gestation variable. Look into the manual page to see how to make it go left to right.

Bivariate summaries Find the correlation between wt and mpg for the built in mtcars data set.

What does the command cor(mtcars) do?

What does the command pairs(mtcars) do?

Make a scatter plot of the two variables.

Load the data set Cars93 from the MASS package. Make a scatterplot of Weight on the $x$ axis and MPG. cityon the $y$ axis. Colour according to Cylinder and adjust the size based on Type.

This webpage has a short bit on visualzing correlation matrices: http://blog.revolution-computing. com/2009/03/visualizing-correlation-matrices.html The

On the webpage: http://labs.dataspora.com/gameday/pitcher/johan-santana/276371 we have a very interesting pair of graphics to baseball fans. These graphics are produced using R and the RApache package. Here we are interested in looking the the data which can be downloaded with:

```
> JS <- read.csv("http://www.math.csi.cuny.edu/verzani/tmp/276371.csv")
```

Using qplot, make a scatter plot of the $x$ and $z$ variables using colour, size or facets to show the other variables.

Head to the website http://learnr.wordpress.com/ and see if you can make any of the graphics.

From the mailing list:

```
hello there,
Is there a way of truncating in the opposite direction so as to retain only
the values to the right of the decimal??
i.e. rather than:
> trunc(39.5)
[1] }3
i would get something like:
> revtrunc(39.5)
[1] 0.5
I've been searching to no avail but I imagine there is a very simple
solution!
Tyler
```

Any help? (just to show what trunc does)

## 2 Data Manipulation

Understand structure of $\mathbf{R}$ objects Load the Aids2 data set in the MASS package. Describe the structure of the data set: how many variables, cases, types of variables, ...

Use editor and read.table Enter the following values into $R$ using an editor and read.table

| Age | Height |
| :---: | :---: |
| 10 | 48 |
| 10 | 52 |
| 11 | 54 |
| 11 | 60 |
| 12 | 51 |

Use write.csv, read.csv Open Excel, enter the same data, save as a "csv" file and then read into $R$ via read.csv.

Creating sequences, random data Create the following sequences using : or seq or rep or some other means.

1. $5,4,3,2,1$
2. $2,4,6,8,10$
3. $1,1,1,1,1$
4. $1,1,1,1,1,2,2,2,2,2$

The sample function How many times on average would you run sample (1:3) before the output is $3,2,1$ ? Try it

Subscripting: vectors, matrices, data frames, lists Assign x to be 1:10. Find commands that return: all but the first element, all but the last element, all elements more than 5 , the index of the elements that are even ( $\% \%$ ).

Which of these (any, some, all?) will remove a row from a data frame?

```
> require(MASS)
> m <- Cars93[1:5, 1:6]
> names(m)
```

```
[1] "Manufacturer" "Model" "Type" "Min.Price" "Price"
```

[1] "Manufacturer" "Model" "Type" "Min.Price" "Price"
[6] "Max.Price"
[6] "Max.Price"
> byNegativeIndex <- m[, -2]
> byNegativeIndex <- m[, -2]
> usingLogical <- m[, names(m) != "Model"]
> usingLogical <- m[, names(m) != "Model"]
> usingListInfo <- m
> usingListInfo <- m
> usingListInfo$Model <- NULL
> usingListInfo$Model <- NULL
> usingSubset <- subset(m, select = names(m) != "Model")

```
> usingSubset <- subset(m, select = names(m) != "Model")
```

From the R mailinglist:

So how do I select all temperatures of 90 and 80 ie Temp $=c(80,90)$ from the airquality data set?

From the R mailinglist
I am trying to extract one particular piece of data(Float) from all the data returned by yahooKeystats, but thus far I'm having no luck. This is what I've got so far:

```
> library(fImport) # must install
Loading required package: timeSeries
Loading required package: timeDate
> data<-yahooKeystats("IBM")
```

Is there a way to just pull out the number of float shares? Something along the lines of:

```
data$Float or data[Float]?
```

From the R mailinglist
Hello all,
I have to import numeric data from file but found it contains Infinite values which need to be eliminated. I tried to replace them in this way:

```
data[which(data=="-Inf")] <- -0.3
data[which(data=="+Inf")] <- 0.3
```

Start with

```
> x <- c(Inf, 1, 2)
```

and replace the "Inf" with 0.3 .

## Working with factors

Reshaping data 1. From the mailing list:
Hi. I have a 925 by 925 correlation matrix corM. I want to identify all variables that have correlation greater than 0.9 . Can anyone suggest an " R way" of doing this?
Have a go:

```
> n <- 10
> m <- matrix(runif(n * n), nrow = n)
```

Some solutions:

```
> data.frame(m) > 0.9
\begin{tabular}{lrrrrrrrrr} 
& X1 & X2 & X3 & X4 & X5 & X6 & X7 & X8 & X9
\end{tabular} X10
```

[5,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE [6,] FALSE TRUE FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE [7,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE [8,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [9,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE [10,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE Or keeping as a matrix

```
> matrix(m > 0.9, nrow = n)
            [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8] [,9] [,10]
    [1,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
    [2,] FALSE FALSE TRUE FALSE FALSE FALSE TRUE FALSE FALSE FALSE
    [3,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE
    [4,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE
    [5,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE
    [6,] FALSE TRUE FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE
    [7,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE
    [8,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
    [9,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
[10,] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
```

Or (Uwe Ligges), the following
> rownames $(m)<-$ colnames $(m)<-$ letters[1:n]
> iind <- row(m)[m > 0.9]
$>$ jind <- col(m)[m > 0.9]
> cbind(rownames (m)[iind], colnames(m)[jind])
[,1] [,2]
[1,] "f" "b"
[2,] "b" "c"
[3,] "b" "g"
[4,] "f" "g"
[5,] "c" "i"
[6,] "d" "i"
[7,] "e" "i"
[8,] "g" "i"

Using which (Dimitris):

```
> which(m > 0.9, arr.ind = TRUE)
    row col
f 6 2
b 2 3
b 2 7
f 6 7
C 3 9
d 4 9
e 5 9
g 7 9
```

2. Is there a way to omit empty cells?
```
> a <- c(1.1, 2.1, 9.1)
> b <- cut(a, 0:10)
> c <- data.frame(b, b)
> d <- table(c)
> dim(d)
[1] 10 10
```

Using interaction

```
> table(interaction(c, drop = T))
(1,2].(1,2] (2,3].(2,3] (9,10].(9,10]
```

Hadley W. Solution:

|  |  | b | b.1 |
| :--- | ---: | ---: | ---: |
|  | V1 |  |  |
| 1 | $(1,2]$ | $(1,2]$ | 1 |
| 2 | $(2,3]$ | $(2,3]$ | 1 |
| 3 | $(9,10]$ | $(9,10]$ | 1 |

3. Again from the mailing list:

How can I delete both rows and columns that do not meet a particular cut off value. Example:

```
> d <- rbind(c(0, 1, 6, 4), c(2, 5, 7, 5), c(3, 6, 1, 6), c(4,
+ 4, 4, 4))
> f <- as.matrix(d)
> f
\begin{tabular}{lrrrr} 
& {\([, 1]\)} & {\([, 2]\)} & {\([, 3]\)} & {\([, 4]\)} \\
{\([1]\),} & 0 & 1 & 6 & 4 \\
{\([2]\),} & 2 & 5 & 7 & 5 \\
{\([3]\),} & 3 & 6 & 1 & 6 \\
{\([4]\),} & 4 & 4 & 4 & 4
\end{tabular}
```

I would like to delete all rows and columns that do not contain at least one element with a value less than 1 . So I'd end up with:
$>f$
[,1] [,2] [,3]
$[1] \quad 0 \quad 1 \quad$,
$[3] \quad 3 \quad 6 \quad$,
Several solutions for you to try to understand: Stephan Kolassa:

```
> f[rowSums(f <= 1) > 0, colSums(f <= 1) > 0]
    [,1] [,2] [,3]
[1,] 0 1 %
[2,] 
```

Wacek Kusnierczyk has this elegant method:

```
> dd = d <= 1
> d[apply(d, 1, any), apply(d, 2, any)]
    [,1] [,2] [,3] [,4]
[1,] 0
[2,] 
[3,] 3
[4,] 4
Rolf Turner gives similar using a function (functions to come later)
> d[apply(d, 1, function(x) {
+ any(x <= 1)
+ }), apply(d, 2, function(x) {
+ any(x <= 1)
+ })]
    [,1] [,2] [,3]
[1,] 0
[2,]
```


## 3 Inference

The t-test (MASS) The shoes data set in MASS has amount of shoe wear on R and L shoes of 10 boys. Do a one sample test of A with a mean of 10 for $H_{0}$.
Do two sample paired and unpaired tests for equivalence of means. Repeat with the wilcox.test function.

Lattice graphics (MASS) For the whiteside data set in the MASS package, make an xyplot with Gas as a dependent variable and Temp a dependent variables. Include two panels base on the value of Insul.
(HSAUR) The plasma data set from the HSAUR package has variables ESR, fibrinogen and globulin. ESR is a thresholded sedimentation rate, and is binary.
A plot of the conditional distribution is given by cdplot. What does this graphic show: cdplot(ESR ~ fibrinogen, data=plasma)? Now fit a logistic regression model, storing the model fit in the variable res. What does this command return: confint(res, parm='fibrinogen')? (The CI for log-odds increase by stepping 1 unit.)

Simple regression Fit a linear model for Gas with Temp as a predictor for each level of Insul.
Assessment of model fit Look at the diagnostic plots for the two models you just made.
Multiple regression Use anova to compare the models Gas $\sim$ Temp and Gas $\sim$ Temp + Insul.
(MASS) For the hills data set in the MASS package fit the model time $\sim$ dist + climb. Look at the diagnostic plots to investigate outliers in the linear model.
Can you refit the above, excluding the "Knock Hill" data point? Excluding both "Knock Hill" and "Ben of Jura"?
The weight argument allows for weighted regression. Fit the model with weight=1/dist ^2.
Binary logistic regression (Neely, http://www.stat.wisc.edu/ neely/Site/CDE
The Chile data set in the car package are from a nation survey in Chile. There are missing values in the data set. (See help page).
Make an exploratory plot of vote versus statusquo for the votes which were Y or N (The variable has 4 levels, we restrict to two for logistic regression purposes.)
Fit the logistic regression model to predict vote based on statusquo for those who voted Y or N .

## 4 Programming

For loops Use a for loop to compute $\binom{52}{5}$ writing this as

$$
\binom{52}{5}=\frac{52}{5} \cdot \frac{51}{4} \cdot \frac{50}{3} \cdot \frac{49}{2} \cdot \frac{48}{1}
$$

((The choose function is a better alternative.)
if the matrix $m$ is generated by the command matrix (rnorm(100), nrow=10), use a for loop to find the median of each column. (An alternative to apply (m, 2, median).
From the mailing list:
Hi everyone, I am trying to accomplish a small task that is giving me quite a headache. I would like to automatically generate a series of matrices and give them successive names. Here is what I thought at first:

```
t1<-matrix(0, nrow=250, ncol=1)
for(i in 1:10){
t1[i]<-rnorm(250)
}
```

What I intended was that the loop would create 10 different matrices with a single column of 250 values randomly selected from a normal distribution, and that they would be labeled $\mathrm{t} 11, \mathrm{t} 12$, t 13 , t 14 etc.
Can anyone steer me in the right direction with this one?
Thanks!
Brendan
Solution by Jorge Ivan Velez:

```
> bigt <- sapply(1:10, function(x) rnorm(5))
> colnames(bigt) <- paste("t", 1:10, sep = "")
> bigt
```

|  | t 1 | t 2 | t 3 | t 4 | t | t |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| $[1]$, | -1.03358946 | 0.49541963 | 0.08239991 | 0.9333845 | 1.47921195 | -0.6188329 |
| $[2]$, | -0.05923464 | -0.02887876 | -0.23569494 | -1.3016770 | 0.08373286 | -1.3251205 |
| $[3]$, | 0.18630620 | -1.08695434 | 1.91712716 | -0.4095879 | 1.37963134 | 0.2870747 |
| $[4]$, | -0.17340744 | -1.14212533 | -1.11947089 | 0.1360216 | -0.17080010 | -0.5865833 |
| $[5]$, | 0.05581644 | -0.31621291 | -0.89486570 | -2.0215362 | -0.07912180 | 1.3948760 |
|  |  |  |  |  |  |  |
| $[1]$, | 1.1431901 | -0.3121529 | -1.8006786 | 0.85110089 |  |  |
| $[2]$, | 0.1567099 | 0.6563149 | 1.8107636 | 1.01191529 |  |  |
| $[3]$, | -0.4295507 | -0.5949102 | 2.3688001 | -0.07232937 |  |  |
| $[4]$, | 0.8276459 | -0.2627074 | -1.2046398 | -0.23821795 |  |  |
| $[5]$, | -1.7580465 | -1.0337979 | 0.5236957 | 1.09290875 |  |  |

From the mailing list:
I would like to create a matrix in $R$ that looks similar to this:
[,1] [,2] [,3] [,4]
[1,] NaN $1 \quad 2 \quad 3$
[2,] NaN 1
[3,] $\mathrm{NaN} \quad 1 \quad 2 \quad 5$
[4,] NaN $2 \begin{array}{llll} & 3\end{array}$
[5,] $\mathrm{NaN} 2 \begin{array}{llll} & 2 & 5\end{array}$
$[6] \quad \mathrm{NaN} \quad 3 \quad 4 \quad$,

I have the loop below:
where A for example is 5
matrixx<-function(A)\{
$B=$ matrix (NaN, nrow= (A+1), ncol=4)
for $(\mathrm{k}$ in 1: $(\mathrm{A}+1)$ )\{
for (i in 1: (A-2)) \{
for $(j$ in (i+2):A)\{
\}
\}
\}
$B[k]=,c(N a N, i,(i+1), j)$
print(B)
\}

But it only prints the final line in:
> matrixx(5)
[,1] [,2] [,3] [,4]
[1,] NaN NaN NaN NaN
[2,] NaN NaN NaN NaN
[3,] NaN NaN NaN NaN
[4,] NaN NaN NaN NaN
[5,] NaN NaN NaN NaN
[6,] $\mathrm{NaN} \quad 3 \quad 4 \quad 5$

Could anyone give me a hand? Would be much appreciated.

Thanks Emma
Hadley Wickam offers

```
> candidates <- t(combn(5, 3))
> firstdiff <- candidates[, 2] - candidates[, 1]
```

```
> cbind(NaN, candidates[firstdiff == 1, ])
```

|  | $[, 1]$ | $[, 2]$ | $[, 3]$ | $[, 4]$ |
| :--- | ---: | ---: | ---: | ---: |
| $[1]$, | NaN | 1 | 2 | 3 |
| $[2]$, | NaN | 1 | 2 | 4 |
| $[3]$, | NaN | 1 | 2 | 5 |
| $[4]$, | NaN | 2 | 3 | 4 |
| $[5]$, | NaN | 2 | 3 | 5 |
| $[6]$, | NaN | 3 | 4 | 5 |

Define a function Define your own functions to do find the mean and standard deviation of a variable. How would you write them so that the input could be a vector, matrix or data frame?

Can you write a function to compute $\binom{n}{k}$ writing this as

$$
\binom{n}{k}=\prod \frac{n}{k} \cdot \frac{n-1}{k-1} \cdots \frac{n-k+1}{k-k+1}
$$

The negative $\log$-likelihood function for $n$ normal data points is a function of parameters $\mu, \sigma$ that depends on data $x$ defined by

$$
L(\mu, \sigma ; x)=-\sum_{i} \log \phi\left(x_{i} ; \mu, \sigma\right)
$$

Write a function that produces this function that depends on x , mu and sigma.
The book Bayesian Computation with $R$ by Jim Albert has code to compute the log posterior density, similar to the last question. In that text, the function has one argument for the parameters (theta) and one for the data (data). An example computation is if one places a $\operatorname{Normal}(10,20)$ prior on $\mu$ and flat prior on $\log \sigma$ then the $\log$ posterior has the form

$$
\log g(\theta \mid x)=\log \phi(\mu ; 10,20)+\sum_{i} \log \phi\left(x_{i} ; \mu, \sigma\right)
$$

Implement this in a function. Can you write the function for the case that theta is a $n$ by 2 matrix of values and the return value is an $n$ by 1 matrix?

The optim function will find a minimum of a function. It uses a function for the second argument. Here is a silly way to solve for the minimum of a quadratic

```
> f <- function(x) x^2 - 3 * x + 10
> out <- optim(c(x = 1), f)
> f(out$par) - out$value
x
0
```

Write a function to evaluate $f(x)=x^{6}-3 x+12$ and use optim to solve for the point of minimum.

Simulation Write a simulation to study the central limit theorem when the population is the $t$ distribution with small degrees of freedom.

From the mailinglist
Dear R People:
Has anyone produced code for a Julia set, please?
It's not all that tough to do, just thought I'd check before re-inventing the wheel.

Recursion Can you write a recursive function to find $n$ ! for positive integer $n$ ?
Aggregation For the iris data set, find numeric summaries of each of the first 4 variables for each level of Species.

