Example Rmarkdown Notebook

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Matrix Algebra and Functions

There are five basic data structures in R: vectors, matrices, arrays, lists, and data.frames. We'll be going through each of these here, but if you want an in depth exploration of these I'd recommend Norman Matloff's *The Art of R Programming: A Tour of Statistical Software Design*.

Matrix basics

Up to this point, we've primarily *talked* about vectors. We've encountered other data types, but haven't used them. Vectors have length, but no width (they can only represent one variable at a time). Matrices are just collections of vectors (exactly like you learned in math camp). We can combine them by column using cbind, or by row, using rbind. We then access elements of matrix by matrix [row, column].

```
vap <- voting.age.population <- c(3481823, 496387, 4582842, 2120139,26955438,3617942,26731
total.votes <- tv <- c(NA, 238307, 1553032, 780409,8899059,1586105, 1162391,258053, 122356
m1 <- cbind(vap, tv) # Combined by column
m2 <- rbind(vap, tv) # combined by row
m2[1,2] # first row, second column
##
      vap
## 496387
m1[,1] # the ith colum
                            4582842
                                     2120139 26955438
    [1]
         3481823
                    496387
                                                        3617942
                                                                  2673154
##
    [8]
          652189
                    472143 14085749 6915512
                                                995937
                                                        1073799
                                                                  9600372
                  2265860
                                                                  4242214
## [15]
         4732010
                            2068253
                                     3213141
                                               3188765
                                                        1033632
## [22]
         4997677
                  7620982
                            3908159
                                     2139918
                                               4426278
                                                         731365
                                                                 1321923
                            6598368
## [29]
         1870315
                  1012033
                                     1452962 14838076
                                                        6752018
                                                                   494923
## [36]
         8697456
                  2697855
                            2850525
                                     9612380
                                                824854
                                                        3303593
                                                                   594599
                            1797941
                                                                 1421717
## [43]
         4636679 17038979
                                      487900
                                               5841335
                                                        4876661
## [50]
         4257230
                    392344
m1[1:5,1:2] # a submatrix
##
                       t.v
             vap
## [1,]
         3481823
                       NA
## [2,]
          496387
                  238307
## [3,]
         4582842 1553032
## [4,]
         2120139
                  780409
## [5,] 26955438 8899059
m2[1,1:10]
    [1]
         3481823
                    496387
                           4582842
                                     2120139 26955438
                                                        3617942
##
    [8]
          652189
                    472143 14085749
```

```
m2[1:2, 1:10]
        [,1] [,2] [,3] [,4]
                                     [,5] [,6] [,7] [,8] [,9]
## vap 3481823 496387 4582842 2120139 26955438 3617942 2673154 652189 472143
       NA 238307 1553032 780409 8899059 1586105 1162391 258053 122356
##
        [,10]
## vap 14085749
## tv 4884544
m2[, 1:10] # same as previous line since there are only two rows.
        [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8] [,9]
## vap 3481823 496387 4582842 2120139 26955438 3617942 2673154 652189 472143
         NA 238307 1553032 780409 8899059 1586105 1162391 258053 122356
## tv
##
         [,10]
## vap 14085749
## tv
      4884544
class (m2)
## [1] "matrix"
However, we can also create matrices directly, we don't need to create vectors first:
#Another way to specify a matrix
matrix(1:10, nrow = 5)
  [,1] [,2]
## [1,] 1 6
## [2,]
          2
              7
       3
## [3,]
             8
             9
## [4,]
         4
## [5,] 5 10
matrix(1:10, ncol = 2) #the same
## [,1] [,2]
## [1,] 1 6
          2
              7
## [2,]
## [3,]
         3
             8
## [4,]
         4
             9
         5
            10
## [5,]
matrix(1:10, nrow = 5, ncol = 2) # the same
## [,1] [,2]
## [1,] 1 6
## [2,]
          2
              7
         3
              8
## [3,]
## [4,]
         4
             9
## [5,]
         5 10
matrix(1:10, nrow = 5, byrow = TRUE) ## not the same
## [,1] [,2]
## [1,] 1 2
         3
              4
## [2,]
## [3,] 5
             6
        7
## [4,]
```

[5,] 9 10

By default, R will fill each column of a matrix, and then move to the next one. If you specify byrow = TRUE, however, R will fill each row, and then move onto the next one.

Arrays and attributes

Arrays are a more general way to store data. Where a matrix can only have 2 dimensions (rows and columns), arrays can have an arbitrary number of dimensions, but this *will* increase the amount of memory they consume.

Let's examine a cube of dimensions $3 \times 4 \times 2$. One way of thinking of this is two 3×4 matrices stacked on top of each other:

```
a \leftarrow array(1:24, dim = c(3, 4, 2))
## , , 1
##
     [,1] [,2] [,3] [,4]
##
## [1,]
         1 4 7 10
             5 8
## [2,] 2
                      11
## [3,]
        3 6 9
                      12
##
## , , 2
##
##
      [,1] [,2] [,3] [,4]
## [1,]
       13
             16
                19
                     22
       14
             17
                  20
                       23
## [2,]
## [3,]
         15
             18
                  21
                       24
```

Since this array has three dimensions, there are now three indices we can use to access the array:

```
a[, , 1]
     [,1] [,2] [,3] [,4]
## [1,]
       1 4
                  7
                      10
             5
## [2,]
        2
                  8
                      11
         3 6 9 12
## [3,]
a[, 1, ]
## [,1] [,2]
## [1,]
       1 13
## [2,]
         2
             14
             15
## [3,]
         3
a[1, ,]
  [,1] [,2]
## [1,]
         1
             13
## [2,]
         4
             16
## [3,]
        7
             19
## [4,]
        10
             22
a[1, 1, ]
## [1] 1 13
a[, 1, 1]
## [1] 1 2 3
a[1, 1, 1]
## [1] 1
```

Notice that the 'dim' is asssigned. This is an "attribute" of the array; attributes are some piece of data associated with the structure that isn't the data itself, and are used to make working with these data easier.

```
dim(a)
## [1] 3 4 2
attributes (a)
## $dim
## [1] 3 4 2
str(a)
   int [1:3, 1:4, 1:2] 1 2 3 4 5 6 7 8 9 10 ...
Matrices also have this attribute (dim), and also have and attribute dimnames (), which are strings (techni-
cally lists of strings, but we'll get to that in a minute), which allow you to label your observations.
dim(m1) # number of rows, number of columns
## [1] 51 2
attributes (m1) # there is another attribute here -- the columns have names
## $dim
## [1] 51
##
## $dimnames
## $dimnames[[1]]
## NULL
##
## $dimnames[[2]]
## [1] "vap" "tv"
dimnames (m1) # we can either assign or get the dimnames attribute
## [[1]]
## NULL
##
## [[2]]
## [1] "vap" "tv"
# The first part is the rownames (which we didn't assign)
dimnames (m2) # here the columns have no names
## [[1]]
## [1] "vap" "tv"
##
## [[2]]
## NULL
dimnames (m1) [[2]][1] <- "Dracula"</pre>
head(m1) # We have re-named the first column to have the name "Dracula"
         Dracula
                        tv
## [1,]
         3481823
                        NA
## [2,]
          496387 238307
## [3,]
         4582842 1553032
## [4,]
         2120139
                   780409
## [5,] 26955438 8899059
```

```
## [6,] 3617942 1586105
dimnames (m1) [[2]][1] <- "vap" # all of this bracketing is because this is a list ... what's
head (m1)
##
             vap
                       tv
                   NA
## [1,] 3481823
## [2,] 496387 238307
## [3,] 4582842 1553032
## [4,] 2120139 780409
## [5,] 26955438 8899059
## [6,] 3617942 1586105
R is flexible, and there are multiple ways to access dimnames:
# Another way to do this
colnames (m1)
## [1] "vap" "tv"
# How would we rename the first column?
colnames (m2)
## NULL
rownames (m1)
## NULL
rownames (m2)
## [1] "vap" "tv"
```

Lists

One downside to matrices and vectors is that every element in them must be the same type (all numerics, or all intergers, or all character vectors). Lists offer a way around this restriction, they can combine multiple data types. Lists are a very flexible way to store data, and are maybe the most common data structure you'll encounter: many functions produce lists.

```
list.a <- list(m1, vap, 3) # m1 is a matrix, vap is a vector, 3 is an integer
list.a</pre>
```

```
## [[1]]
##
                        tν
              vap
          3481823
##
    [1,]
                        NA
##
    [2,]
           496387
                   238307
##
    [3,]
          4582842 1553032
##
    [4,]
          2120139
                   780409
##
    [5,] 26955438 8899059
          3617942 1586105
##
    [6,]
##
    [7,]
          2673154 1162391
##
    [8,]
           652189
                   258053
##
    [9,]
           472143
                   122356
## [10,] 14085749 4884544
  [11,]
          6915512 2143845
##
## [12,]
           995937
                    348988
## [13,]
          1073799
                   458927
## [14,]
          9600372 3586292
##
  [15,]
          4732010 1719351
## [16,]
          2265860 1071509
## [17,]
          2068253
                   864083
## [18,]
          3213141 1370062
## [19,]
          3188765
                   954896
## [20,]
          1033632
## [21,]
          4242214 1809237
## [22,]
          4997677 2243835
## [23,]
          7620982 3852008
## [24,]
          3908159 2217552
## [25,]
          2139918
## [26,]
          4426278 2178278
## [27,]
           731365
                   411061
## [28,]
          1321923
                    610499
## [29,]
          1870315
                    586274
## [30,]
          1012033
                    418550
## [31,]
          6598368 2315643
## [32,]
          1452962
                    568597
## [33,] 14838076 4703830
## [34,]
          6752018 2036451
## [35,]
           494923
                   220479
## [36,]
          8697456 4184072
## [37,]
          2697855
                        NA
## [38,]
          2850525 1399650
## [39,1
          9612380
                        NA
## [40,]
           824854
                    392882
## [41,]
          3303593 1117311
## [42,]
           594599
                   341105
## [43,]
          4636679 1868363
```

```
## [44,] 17038979
## [45,] 1797941 582561
## [46,]
          487900 263025
## [47,] 5841335 2398589
## [48,]
         4876661 2085074
## [49,]
         1421717
                 473014
         4257230 2183155
## [50,]
## [51,]
          392344
                 196217
##
## [[2]]
## [1]
        3481823
                 496387 4582842 2120139 26955438
                                                   3617942 2673154
## [8]
         652189
                  472143 14085749 6915512
                                            995937
                                                   1073799 9600372
## [15]
        4732010 2265860 2068253 3213141
                                          3188765
                                                   1033632 4242214
                         3908159 2139918 4426278
## [22]
        4997677 7620982
                                                    731365 1321923
## [29] 1870315
                 1012033
                         6598368 1452962 14838076
                                                   6752018
                                                             494923
## [36]
       8697456
                2697855
                         2850525 9612380
                                            824854
                                                    3303593
                                                             594599
## [43] 4636679 17038979
                         1797941
                                  487900 5841335
                                                   4876661 1421717
## [50] 4257230
                  392344
##
## [[3]]
## [1] 3
```

We can make all sorts of lists, and can even create lists containing other lists!

```
vector1 <- c(1,2,3)
gospels <- c("matthew", "mark", "luke", "john")</pre>
my.matrix <- matrix(c(1:20), nrow=4)</pre>
my.data <- data.frame(cbind(vap, tv))</pre>
my.crazy.list <- list(vector1, gospels, my.matrix, TRUE, list.a)</pre>
my.crazy.list # we can combine anything we want -- we can even include other lists in our
## [[1]]
## [1] 1 2 3
##
## [[2]]
## [1] "matthew" "mark"
                                        "john"
                             "luke"
##
## [[3]]
        [,1] [,2] [,3] [,4] [,5]
                 5
                          13
## [1,]
           1
                      9
                                17
## [2,]
           2
                 6
                     10
                          14
                                18
## [3,]
                 7
           3
                          15
                                19
                     11
## [4,]
                     12
                          16
                                20
##
## [[4]]
## [1] TRUE
##
## [[5]]
## [[5]][[1]]
##
               vap
##
   [1,]
         3481823
                        NA
## [2,]
          496387 238307
## [3,] 4582842 1553032
##
    [4,]
          2120139
                   780409
## [5,] 26955438 8899059
```

```
##
   [6,] 3617942 1586105
   [7,] 2673154 1162391
##
##
   [8,]
         652189 258053
   [9,]
          472143 122356
##
## [10,] 14085749 4884544
## [11,] 6915512 2143845
## [12,]
         995937 348988
## [13,] 1073799 458927
## [14,]
         9600372 3586292
## [15,] 4732010 1719351
## [16,] 2265860 1071509
## [17,] 2068253 864083
## [18,] 3213141 1370062
## [19,] 3188765 954896
## [20,] 1033632
                      NA
## [21,] 4242214 1809237
## [22,] 4997677 2243835
## [23,]
         7620982 3852008
         3908159 2217552
## [24,]
## [25,]
         2139918
## [26,] 4426278 2178278
## [27,]
         731365 411061
## [28,] 1321923 610499
## [29,] 1870315 586274
## [30,] 1012033 418550
## [31,] 6598368 2315643
## [32,] 1452962 568597
## [33,] 14838076 4703830
## [34,] 6752018 2036451
## [35,1
         494923 220479
## [36,] 8697456 4184072
## [37,]
         2697855
## [38,] 2850525 1399650
## [39,] 9612380
                     NA
## [40,]
         824854 392882
## [41,] 3303593 1117311
## [42,]
         594599 341105
## [43,] 4636679 1868363
## [44,] 17038979
## [45,] 1797941 582561
         487900 263025
## [46,]
## [47,] 5841335 2398589
## [48,] 4876661 2085074
## [49,] 1421717 473014
## [50,] 4257230 2183155
## [51,] 392344
                 196217
##
## [[5]][[2]]
## [1] 3481823
                 496387 4582842 2120139 26955438 3617942 2673154
## [8]
         652189
                 472143 14085749 6915512
                                           995937
                                                   1073799 9600372
        4732010 2265860 2068253 3213141
                                          3188765
                                                   1033632
## [15]
                                                            4242214
## [22]
       4997677 7620982 3908159 2139918 4426278
                                                   731365 1321923
## [29] 1870315 1012033 6598368 1452962 14838076
                                                   6752018
                                                             494923
## [36] 8697456 2697855 2850525 9612380
                                          824854 3303593
                                                             594599
```

```
## [43] 4636679 17038979 1797941 487900 5841335 4876661 1421717
## [50] 4257230 392344
##
## [[5]][[3]]
## [1] 3
What if we want to access the attributes of our list?
str(my.crazy.list) # the str() function is useful for looking at the basic components
## List of 5
## $ : num [1:3] 1 2 3
## $ : chr [1:4] "matthew" "mark" "luke" "john"
## $ : int [1:4, 1:5] 1 2 3 4 5 6 7 8 9 10 ...
## $ : logi TRUE
## $ :List of 3
##
    ..$ : num [1:51, 1:2] 3481823 496387 4582842 2120139 26955438 ...
    ....- attr(*, "dimnames")=List of 2
     .. .. ..$ : NULL
##
    .. .. ..$ : chr [1:2] "vap" "tv"
##
     ..$ : num [1:51] 3481823 496387 4582842 2120139 26955438 ...
     ..$ : num 3
# of any complicated object like this
#str() will work with most types of objects
attributes (my.crazy.list) # lists has attributes, but we haven't set them
## NULL
length (my.crazy.list) # this reports the number of major sub-elements in the list
## [1] 5
dim(my.crazy.list) # this won't work for complicated lists
## NULL
names(my.crazy.list) <- c("one", "two", "three", "four", "five")</pre>
str(my.crazy.list) # now each part of the list has a name attribute
## List of 5
## $ one : num [1:3] 1 2 3
## $ two : chr [1:4] "matthew" "mark" "luke" "john"
## $ three: int [1:4, 1:5] 1 2 3 4 5 6 7 8 9 10 ...
## $ four : logi TRUE
## $ five :List of 3
     ..$: num [1:51, 1:2] 3481823 496387 4582842 2120139 26955438 ...
##
    ... - attr(\star, "dimnames")=List of 2
##
##
    .. .. ..$ : NULL
     .. .. ..$ : chr [1:2] "vap" "tv"
##
##
     ..$ : num [1:51] 3481823 496387 4582842 2120139 26955438 ...
     ..$ : num 3
my.crazy.list
## $one
## [1] 1 2 3
```

##

```
## $two
## [1] "matthew" "mark" "luke"
                                   "john"
##
## $three
## [,1] [,2] [,3] [,4] [,5]
## [1,] 1 5 9
                      13
          2
              6
                  10
                       14
## [2,]
## [3,]
         3
              7
                   11
                       15
                            19
## [4,]
         4
              8
                   12
                       16
                            20
##
## $four
## [1] TRUE
##
## $five
## $five[[1]]
##
                    tv
             vap
   [1,] 3481823
##
                     NA
##
   [2,]
         496387 238307
   [3,] 4582842 1553032
##
   [4,] 2120139 780409
##
## [5,] 26955438 8899059
##
  [6,] 3617942 1586105
  [7,] 2673154 1162391
##
##
   [8,] 652189 258053
         472143 122356
## [9,]
## [10,] 14085749 4884544
## [11,] 6915512 2143845
## [12,]
         995937 348988
## [13,] 1073799 458927
## [14,] 9600372 3586292
## [15,] 4732010 1719351
## [16,] 2265860 1071509
## [17,] 2068253 864083
## [18,] 3213141 1370062
## [19,]
         3188765 954896
## [20,] 1033632
## [21,] 4242214 1809237
## [22,] 4997677 2243835
## [23,]
         7620982 3852008
## [24,] 3908159 2217552
## [25,] 2139918
## [26,] 4426278 2178278
         731365 411061
## [27,]
## [28,] 1321923 610499
## [29,] 1870315 586274
## [30,] 1012033 418550
## [31,] 6598368 2315643
## [32,] 1452962 568597
## [33,] 14838076 4703830
## [34,] 6752018 2036451
## [35,]
         494923 220479
## [36,] 8697456 4184072
## [37,] 2697855
## [38,] 2850525 1399650
```

```
## [39,] 9612380
## [40,]
          824854 392882
## [41,] 3303593 1117311
## [42,]
          594599 341105
## [43,] 4636679 1868363
## [44,] 17038979
## [45,] 1797941
                  582561
## [46,]
          487900 263025
## [47,]
         5841335 2398589
## [48,]
         4876661 2085074
## [49,]
         1421717
                  473014
## [50,] 4257230 2183155
## [51,] 392344 196217
##
## $five[[2]]
##
   [1] 3481823
                   496387 4582842 2120139 26955438 3617942
                                                                2673154
                  472143 14085749 6915512
                                              995937 1073799 9600372
##
   [8]
         652189
## [15] 4732010 2265860 2068253 3213141
                                             3188765
                                                      1033632 4242214
                 7620982 3908159 2139918
                                            4426278
## [22] 4997677
                                                       731365 1321923
## [29] 1870315 1012033
                          6598368 1452962 14838076
                                                      6752018
                                                                 494923
                                              824854
                                                      3303593
## [36] 8697456 2697855 2850525 9612380
                                                                 594599
## [43] 4636679 17038979 1797941 487900 5841335 4876661 1421717
## [50] 4257230
                   392344
##
## $five[[3]]
## [1] 3
But this can be quite convoluted. Instead, when we create our list, we can give each element a name:
my.crazy.list <- list(one=vector1, two=gospels, three=my.matrix, four=TRUE, five=list.a)</pre>
str(my.crazy.list)
## List of 5
   $ one : num [1:3] 1 2 3
   $ two : chr [1:4] "matthew" "mark" "luke" "john"
## $ three: int [1:4, 1:5] 1 2 3 4 5 6 7 8 9 10 ...
## $ four : logi TRUE
##
   $ five :List of 3
     ..$: num [1:51, 1:2] 3481823 496387 4582842 2120139 26955438 ...
##
     ... - attr(\star, "dimnames")=List of 2
##
##
     ....$ : NULL
     .. .. ..$ : chr [1:2] "vap" "tv"
##
##
     ..$ : num [1:51] 3481823 496387 4582842 2120139 26955438 ...
##
     ..$ : num 3
names (my.crazy.list)
## [1] "one" "two"
                       "three" "four" "five"
Manipulating lists is similar to other manipulations in R, the new one is using double brackets [[]] to
access an element of a list.
# there are several ways to access/add to/subtract from a list
```

my.crazy.list[[1]]

[1] 1 2 3

```
my.crazy.list$one
## [1] 1 2 3
my.crazy.list[1]
## $one
## [1] 1 2 3
my.crazy.list["one"]
## $one
## [1] 1 2 3
my.crazy.list$dracula <- "dracula"</pre>
my.crazy.list # now we have added another element
## $one
## [1] 1 2 3
##
## $two
## [1] "matthew" "mark" "luke"
                                   "john"
##
## $three
## [,1] [,2] [,3] [,4] [,5]
## [1,] 1
             5 9
                      13
                            17
## [2,]
         2
              6 10
                      14
                            18
         3
              7
## [3,]
                  11
                       15
                            19
## [4,]
         4
              8
                 12
                       16
                            20
##
## $four
## [1] TRUE
##
## $five
## $five[[1]]
##
             vap
                     tv
## [1,] 3481823
                     NA
## [2,] 496387 238307
## [3,] 4582842 1553032
## [4,] 2120139 780409
## [5,] 26955438 8899059
## [6,] 3617942 1586105
## [7,] 2673154 1162391
## [8,] 652189 258053
         472143 122356
## [9,]
## [10,] 14085749 4884544
## [11,] 6915512 2143845
## [12,] 995937 348988
## [13,] 1073799 458927
## [14,] 9600372 3586292
## [15,] 4732010 1719351
## [16,] 2265860 1071509
## [17,] 2068253 864083
## [18,] 3213141 1370062
## [19,] 3188765 954896
## [20,] 1033632
                    NA
```

```
## [21,] 4242214 1809237
## [22,] 4997677 2243835
## [23,]
         7620982 3852008
## [24,]
         3908159 2217552
## [25,]
         2139918
## [26,] 4426278 2178278
         731365 411061
## [27,]
## [28,] 1321923 610499
## [29,]
         1870315 586274
## [30,] 1012033 418550
## [31,] 6598368 2315643
## [32,] 1452962 568597
## [33,] 14838076 4703830
## [34,] 6752018 2036451
## [35,]
          494923 220479
## [36,] 8697456 4184072
## [37,] 2697855
## [38,]
         2850525 1399650
## [39,] 9612380
                      NA
## [40,]
         824854 392882
## [41,] 3303593 1117311
## [42,]
         594599 341105
## [43,] 4636679 1868363
## [44,] 17038979
                      NA
## [45,] 1797941 582561
## [46,]
         487900 263025
## [47,] 5841335 2398589
## [48,]
         4876661 2085074
## [49,] 1421717 473014
## [50,] 4257230 2183155
## [51,]
        392344 196217
##
## $five[[2]]
                496387 4582842 2120139 26955438 3617942 2673154
## [1] 3481823
## [8]
         652189
                 472143 14085749 6915512
                                          995937
                                                   1073799 9600372
       4732010 2265860 2068253 3213141 3188765
## [15]
                                                   1033632 4242214
## [22] 4997677 7620982 3908159 2139918 4426278
                                                   731365 1321923
## [29] 1870315 1012033 6598368 1452962 14838076
                                                   6752018
                                                             494923
## [36] 8697456 2697855
                         2850525 9612380
                                           824854
                                                   3303593
                                                             594599
## [43] 4636679 17038979 1797941 487900 5841335 4876661 1421717
## [50] 4257230
                  392344
##
## $five[[3]]
## [1] 3
##
##
## $dracula
## [1] "dracula"
# We can repeat this accessing method
my.crazy.list[[3]][1,] # first row of my.matrix
```

[1] 1 5 9 13 17

```
my.matrix[1,] #the same
## [1] 1 5 9 13 17
```

However, you cannot do math on lists directly (note that this is set to eval = FALSE, since if we ran it, it throws an error and the document doesn't compile):

```
my.crazy.list +2 # not so much
my.crazy.list[[3]] + 2
```

Matrix operations

Matrices are the workhorses of computational statistics. And just like there are special ways of manipulating matrices in mathematics, there are special operators in R for working with them. Unless you tell R explictly, however, it *will* operate element-wise on a matrix.

```
# A couple of matrices
H3 <- matrix(c(1, 1/2, 1/3, 1/2, 1/3, 1/4, 1/3, 1/4, 1/5), nrow=3)
##
             [,1]
                       [,2]
                                  [,3]
## [1,] 1.0000000 0.5000000 0.3333333
## [2,] 0.5000000 0.3333333 0.2500000
## [3,] 0.3333333 0.2500000 0.2000000
1/cbind(seq(1,3), seq(2,4), seq(3,5)) # most basic function continue to be "element wise"
##
             [,1]
                       [,2]
                                 [,3]
## [1,] 1.0000000 0.5000000 0.3333333
## [2,] 0.5000000 0.3333333 0.2500000
## [3,] 0.3333333 0.2500000 0.2000000
H3+1
##
                     [,2]
            [,1]
                               [,3]
## [1,] 2.000000 1.500000 1.333333
## [2,] 1.500000 1.333333 1.250000
## [3,] 1.333333 1.250000 1.200000
H3*2
##
             [,1]
                       [,2]
                                  [,3]
## [1,] 2.0000000 1.0000000 0.6666667
## [2,] 1.0000000 0.6666667 0.5000000
## [3,] 0.6666667 0.5000000 0.4000000
H3^2
##
             [,1]
                       [,2]
## [1,] 1.0000000 0.2500000 0.1111111
## [2,] 0.2500000 0.1111111 0.0625000
## [3,] 0.1111111 0.0625000 0.0400000
mean (H3) # others will treat the matrix as a vector no matter what
## [1] 0.4111111
rowSums(H3) # others work on matrices in particular ways (more on this later)
## [1] 1.8333333 1.0833333 0.7833333
colSums (H3)
## [1] 1.8333333 1.0833333 0.7833333
rowMeans (H3)
## [1] 0.6111111 0.3611111 0.2611111
colMeans (H3)
## [1] 0.6111111 0.3611111 0.2611111
```

```
# logicals too
H3==1
         [,1] [,2] [,3]
## [1,] TRUE FALSE FALSE
## [2,] FALSE FALSE FALSE
## [3,] FALSE FALSE FALSE
H3 == c(1,2,3) #what's going on here?
         [,1] [,2] [,3]
## [1,] TRUE FALSE FALSE
## [2,] FALSE FALSE FALSE
## [3,] FALSE FALSE FALSE
нз == нз
##
       [,1] [,2] [,3]
## [1,] TRUE TRUE TRUE
## [2,] TRUE TRUE TRUE
## [3,] TRUE TRUE TRUE
Some functions are exact translations of math:
# Some work like they do in the math books
det(H3) # the determinant -- hard for you ... easy in R
## [1] 0.000462963
diag(H3) # get the diagonal elements of amatrix
## [1] 1.0000000 0.3333333 0.2000000
diag(1, nrow=3) # make a 3by3 identity matrix
      [,1] [,2] [,3]
## [1,] 1 O
                1
## [2,]
           0
                     0
                0
                     1
## [3,]
           0
t(H3) # matrix transpose
##
             [,1]
                      [,2]
## [1,] 1.0000000 0.5000000 0.3333333
## [2,] 0.5000000 0.3333333 0.2500000
## [3,] 0.3333333 0.2500000 0.2000000
To access only the lower triangle of a matrix, use the lower.tri() function, and some indexing:
Hnew[lower.tri(H3, diag=TRUE)] # extract the lower triangular elements of H3
## [1] 1.0000000 0.5000000 0.3333333 0.3333333 0.2500000 0.2000000
# why can we just use lower.tri()?
lower.tri(H3, diag=TRUE)
       [,1] [,2] [,3]
## [1,] TRUE FALSE FALSE
## [2,] TRUE TRUE FALSE
## [3,] TRUE TRUE TRUE
```

To get the trace, we'll need to write a function:

```
trace<- function(data) {</pre>
  (sum(diag(data)))
trace(H3)
## [1] 1.533333
To multply matrices we use % * %, the matrix multiplication operator:
t (H3) %*%H3
##
            [,1]
                     [,2]
## [1,] 1.361111 0.7500000 0.5250000
## [2,] 0.750000 0.4236111 0.3000000
## [3,] 0.525000 0.3000000 0.2136111
c(1,2,3)%*%c(1,2,3) # dot product
## [,1]
## [1,] 14
matrix(c(1,2,3), ncol=1)%*%c(1,2,3) # outer product
      [,1] [,2] [,3]
## [1,] 1 2
## [2,]
           2
                4
## [3,]
                      9
To invert a matrix, we use the solve () command, which can also be used to solve a linear system:
solve (H3)
## [,1] [,2] [,3]
## [1,]
          9 -36 30
## [2,] -36 192 -180
## [3,] 30 -180 180
invH3<-solve(H3)
H3%*%invH3 ## close enough?
##
                [,1]
                               [,2] [,3]
## [1,] 1.000000e+00 0.000000e+00
## [2,] 8.881784e-16 1.000000e+00
                                       0
## [3,] 0.000000e+00 -7.105427e-15
# solving a linear system:
b < -c(1, 2, 3)
solve (H3, b)
## [1] 27 -192 210
```

Data analysis - Roll your own linear model

You want to know: is the presidential vote share positively related to GDP growth? One way to test this is with a linear regression model:

But what is this doing? First, adding a constant column to the data, for our y intercept (order matters here)! Then

```
constant <- rep(1, nrow(vote))
X <- cbind(constant, vote$q2gdp)</pre>
```

Then, removing the rows which have missing values:

```
X <- X[!is.na(vote$vote),]
# na.omit(vote) # an alternative way to get rid of NA's in advance
class(X) # it's a matrix (not a data frame) so we can use our solution
## [1] "matrix"</pre>
```

```
is.matrix(X) # alternative approach
```

[1] TRUE

Creating our Y variable:

```
Y <- cbind(vote$vote[!is.na(vote$vote)])
```

and finally, solving $(X'X)^{-1}(X'y)$ (the OLS equation), and checking whether our results are the same as lm():

```
B <- solve((t(X)%*%X))%*%(t(X)%*%Y)
B[1]-coefficients[1] # about zero

## (Intercept)
## -7.105427e-15
B[2] - coefficients[2] # about zero

## q2gdp
## 2.220446e-16</pre>
```

Flow control and functions

You will find that for many tasks your R scripts will start to get *long*. Complex tasks will start turning into complex code.

TIPS:

- 1. If you find yourself copying and pasting more than 2-3 times think about writing a loop or a function instead.
- 2. If you ever spend more than 20 minutes manually reshaping, editing, copying/pasting data that is already encoded and on a computer then somewhere a fairy is killed.
- 3. Some combination of the basic skills in today's lessons can be used to solve most of these kinds of problems although it may take time work out how.

if(){},else(){},ifelse(){}

Let's start with if (), which works as follows: if (condition) {commands}. The input in the parenthesis needs to be something that returns a logical, and tou can put anything in the braces you want:

```
if(TRUE) {print("I got here") } #

## [1] "I got here"

if(FALSE) {print("I also got here") } #
```

You can combine if () with an else() command. Everything in the else{} braces will be executed when the condition is false

```
x <- 3
if(x>2) {
    print("X is larger than 2")
} else { # notice that these are on the same line
    print("X is 2 or smaller")
}

## [1] "X is larger than 2"

x <- (-3)
if(x>2) {
    print("X is larger than 2")
} else { # notice that these are on the same line
    print("X is 2 or smaller")
}
```

[1] "X is 2 or smaller"

However, if () and else() do not play nicely with vectors, so instead we'll use ifelse(), a *vectorized* version of these two commands:

```
# This will throw an error
if (c(1,2)>2) {
  print("This won't work")
}
```

try the ifelse() command instead

```
x <- c(0,2)
ifelse(x > 1, "yes", "no") # but you can only put in values in here, not a bunch of instruct
## [1] "no" "yes"
# beware though ... if your outputs are vectors it will work element-wise
yes <- c("yes1", "yes2")
no <- c("no1", "no2")
ifelse(x>1, yes, no)
```

```
## [1] "no1" "yes2"
```

Note that the braces are not technically necessary if you have only a one line command, but not using them is like writing without punction. Someone can figure out what you're saying, but it makes life harder than it has to be.

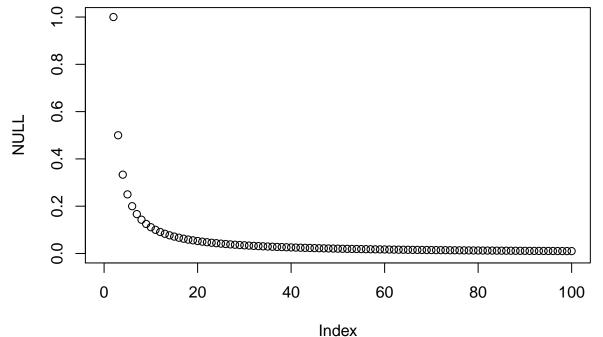
```
x<-3
if (x > 2) y <- 2*x else y <- 3*x
y
```

[1] 6

repeat, break

repeat { Execute these commands over and over again } You had better include a break command in there, or you are not going to be happy. The 'break' command will stop the repeat (it will also work for the for () and while () loops below).

```
plot(NULL, xlim=c(0,100), ylim=c(0,1)) # make a blank plot with the limits set by those ver
x <- 0
repeat {
    y <- 1/x
    x <- x+1
    points(x, y)
    if (x == 100) { break }
}</pre>
```



Example: make the Fibonacci series less than 300:

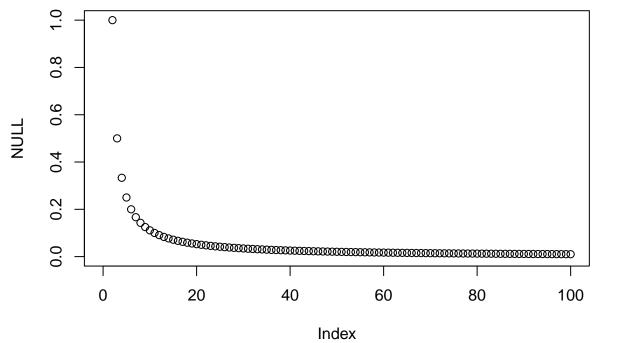
```
# Example: make the Fibonacci series less than 300
Fib1 <- 1
Fib2 <- 1
Fibonacci <- c(0, Fib2)
repeat {
 Fibonacci <- c(Fibonacci, Fib2)
  oldFib2 <- Fib2
 Fib2<-Fib1 + Fib2
 Fib1 <- oldFib2
  if (Fib2 > 300) {break}
Fibonacci
                      2
                          3
                              5
                                  8 13 21 34 55 89 144 233
## [1]
```

^{**}Tip:** Save your files before running any repeat. *Better yet...don't use repeat.* You should write for-loops that can stop on their own.

while()

A while () loop is just a repeat, where the if (condition) {break} is specified at the top. Similar to the above:

```
plot(NULL, xlim=c(0,100), ylim=c(0,1))
x <- 0
while(x < 100) {
    y <- 1/x
    x <- x+1
    points(x,y)
}</pre>
```



```
# Example 2
Fib1 <- 1
Fib2 <- 1
Fibonacci <- c(0, Fib2)
while (Fib2 <= 300) {</pre>
  Fibonacci <- c(Fibonacci, Fib2)
  oldFib2 <- Fib2
  Fib2 <- Fib1 + Fib2
  Fib1 <- oldFib2
Fibonacci
##
   [1]
          0
              1
                       2
                           3
                                5
                                    8 13 21
                                               34 55 89 144 233
```

Example, using the Fearon and Laitin data

Let's say we want to calculate the average number of civil-wars onsets for each level of democratization (polity2)

```
library(foreign)
civilw <- read.dta("repdata.dta")</pre>
democracy <- min(civilw$polity2, na.rm=T)</pre>
output vector <- NULL
index <- 1
while(democracy <= max(civilw$polity2, na.rm=T)){</pre>
  output_vector[index] <- mean(civilw$onset[civilw$polity2 == democracy], na.rm=T)
  democracy <- democracy + 1 # DON'T FORGET THIS LINE OR YOU WILL BE IN AN ENDLESS LOOP
  index <- index + 1 # this line is needed to index forward</pre>
output_vector*100 # civil wars start this percent of the time at each level of democracy
    [1]
         0.5235602
                     1.5015015
                                 1.3623978
                                             1.4115899
                                                        1.9543974
                                                                     4.6875000
         3.4782609
                                 0.9523810
                                             2.0833333 10.7784431
                                                                     4.1095890
##
    [7]
                     1.6574586
         1.8518519
                     3.4482759
                                 3.2051282
                                             3.0303030 1.1299435
  [13]
                                                                     1.4492754
                     0.6993007
## [19]
         2.1875000
                                 0.3289474
plot(c(min(civilw$polity2, na.rm=T):max(civilw$polity2, na.rm=T)), output_vector*100,
     xlab="Polity Scores", ylab="% Civil War Onset")
     10
% Civil War Onset
     \infty
     9
                            0
                                               0
                               0
                                                                     0
                                         0
     \sim
                                  O
                                                               0
                                      0
                                                                         0
            0
           -10
                            -5
                                            0
                                                            5
                                                                           10
                                      Polity Scores
```

In general, this is a pretty hack-y way to calculate this, and you're better off using something like data.table, as discussed in lab 2.

for-loops, next ()

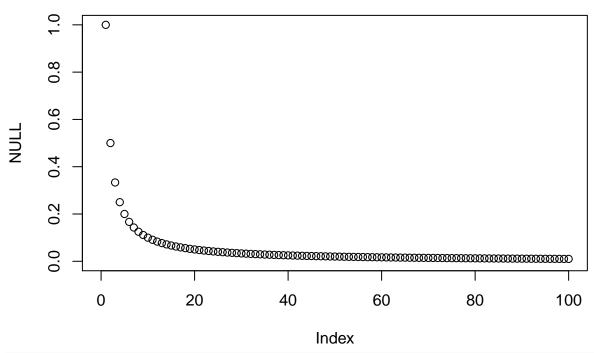
The while loop still requires a lot of attention to indexing. Also ... in many instances all we want to do is increment by 1. So programmers put together a "for loop."

for (name in vector) {execute these commands on each value of the vector} whatever you put into the name slot will become a "local" variable

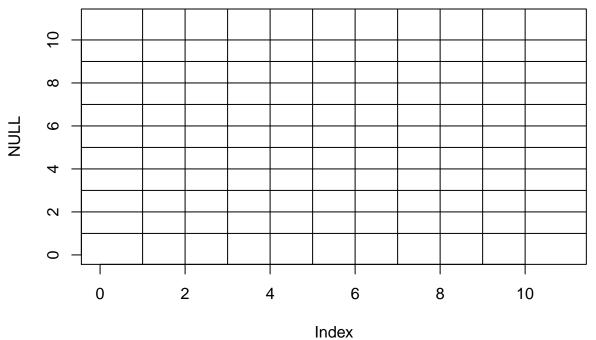
```
for (monkey in c("spider", "howler", "wurst")) {print(monkey)}
## [1] "spider"
## [1] "howler"
## [1] "wurst"
# or more commonly
for (i in 1:20) {
 print(i)
}
## [1] 1
## [1] 2
## [1] 3
## [1] 4
## [1] 5
## [1] 6
## [1] 7
## [1] 8
## [1] 9
## [1] 10
## [1] 11
## [1] 12
## [1] 13
## [1] 14
## [1] 15
## [1] 16
## [1] 17
## [1] 18
## [1] 19
## [1] 20
```

Example of for-loops

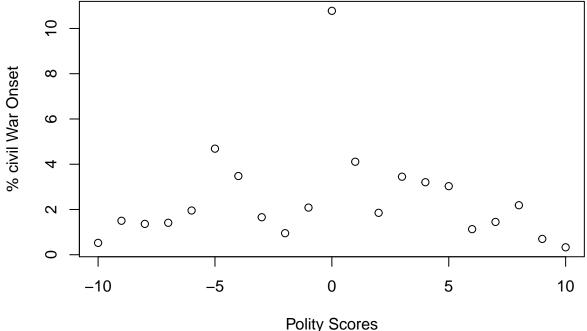
```
plot(NULL, xlim=c(0,100), ylim=c(0,1))
for (i in 0:100) {points(i, 1/i)}
```



```
plot(NULL, xlim=c(0,11), ylim=c(0,11))
for(i in 1:10) {
   abline(v=i)
   abline(h=i)
}
```



```
output <- NULL
for(i in 1:20) {
  output[i] <- 0+i
}</pre>
```



Sometimes you might not want to execute the commands for every element in the vector use the next command to skip (you can also use the break)

```
some odds <- NULL
for (i in 1:200) {
  if (i%%2 != 0) {
    some_odds<-c(some_odds, i)</pre>
  } else { next }
}
some_odds
                           7
                                                                    25
##
      [1]
             1
                 3
                      5
                                9
                                   11
                                        13
                                             15
                                                 17
                                                      19
                                                           21
                                                                23
                                                                         27
                                                                              29
                                                                                  31
                                                                                       33
           35
     [18]
                37
                     39
                          41
                              43
                                   45
                                        47
                                             49
                                                 51
                                                      53
                                                           55
                                                                57
                                                                    59
                                                                         61
                                                                              63
                                                                                  65
                                                                                       67
##
           69
                71
                     73
                          75
                              77
                                   79
                                        81
                                             83
                                                 85
                                                      87
                                                           89
                                                                91
                                                                    93
                                                                         95
                                                                              97
                                                                                  99 101
    [52] 103 105 107 109 111 113 115 117 119 121 123 125 127 129 131 133 135
##
```

[86] 171 173 175 177 179 181 183 185 187 189 191 193 195 197 199

[69] 137 139 141 143 145 147 149 151 153 155 157 159

##

Functions

We have been using functions this whole time, but we can also make our own. This both helps you keep your code organized, and helps you better understand other people's functions. In particular, functions can be helpful if you have a repetitive serious of tasks to perform on your data.

Example:

Here are three ways to write the same function:

```
my_function1 <- function(x) { # take in a value of x</pre>
  y < -x^2 + 3 * x - 2 # conduct some set of operations using the input values
  return(y) # return some value. In this case we are returning a simple numeric value
my_function2 <- function(x) {</pre>
  x^2+3*x-2 # we don't have to specify a return
my_function3 <- function(x) x^2+3*x-2 # for simple functions, we don't even need brackets
my_function1(c(1:20))
               8 16
                      26
                          38
                              52
                                   68
                                       86 106 128 152 178 206 236 268 302 338
## [18] 376 416 458
my_function2(c(1:20))
                      26
                          38
                              52
                                   68
                                       86 106 128 152 178 206 236 268 302 338
               8 16
## [18] 376 416 458
my_function3(c(1:20))
                                       86 106 128 152 178 206 236 268 302 338
          2
               8
                 16
                      26
                          38
                              52
                                   68
## [18] 376 416 458
```

1 or 2 are the preferred ways to write functions, for the same reason we used braces with if() and else(): they make code more legible.

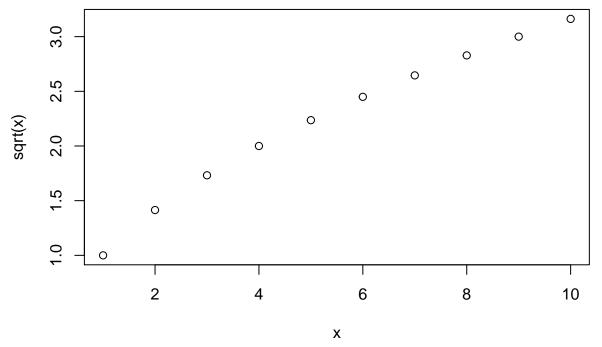
Functions are just another object. We can define the functions using: 1. The word function 2. A pair of round parentheses () which enclose the argument list. The list may be empty. 3. A single statement, or a sequence of statements enclosed in curly braces { }.

Sometimes a function will return a value, but other times it will just execute a command.

```
mad_libs <- function(noun, location, proper_noun, activity) {
    print(paste("One day, I was looking all over for my", noun))
    print(paste("I decided I must have left it at the", location))
    print(paste("When I got there, I found", proper_noun, "using my", noun, "to", activity))
}
mad_libs("baseball", "lake house", "Jan Pierskalla", "eat pudding")

## [1] "One day, I was looking all over for my baseball"
## [1] "I decided I must have left it at the lake house"
## [1] "When I got there, I found Jan Pierskalla using my baseball to eat pudding"</pre>
```

```
sqrt_plotter <- function(x) {
  plot(x, sqrt(x))
}
sqrt_plotter(1:10)</pre>
```



Other times we will want to return a value

```
my_abs <- function(x) {
   ifelse(x<=0, -1*x, x)
}
my_abs(c(-1,2,3,-4,5))</pre>
```

```
## [1] 1 2 3 4 5
```

You can set default values for some of your arguments or all of them:

```
gaga_equation <- function(num_rah=2, num_ah=3, num_ga=2, num_la=2) {
  rahs<-paste(rep("RAH", num_rah), collapse=", ")
  ahs<-paste(rep("AH", num_ah), collapse=", ")
  gas<-paste(rep("GA", num_ga), collapse=", ")
  las<-paste(rep("LA", num_la), collapse=", ")
  paste(rahs, ",", ahs, "! ROMA, ROMAMA!", gas,",", las)
}
gaga_equation()</pre>
```

```
## [1] "RAH, RAH, AH, AH, AH! ROMA, ROMAMA! GA, GA, LA, LA"

gaga_equation(num_rah=5)
```

```
## [1] "RAH, RAH, RAH, RAH, RAH , AH, AH ! ROMA, ROMAMA! GA , GA , LA , LA"
```

Note that variables created within the function are NOT in the global environment, they don't exist "outside" of the function, and cease to exist when the function stops running. In the <code>gaga_equation</code>, you can't call <code>rahs</code> outside of the function.

Many of the functions you will write or work with will return lists, like the summary command.

```
library(foreign)
civilw <- read.dta("repdata.dta")</pre>
my_summary <- function(varname, data=civilw) {</pre>
  attach(civilw)
 this_mean <- mean(varname, na.rm=T)</pre>
 this_var <- var(varname, na.rm=T)</pre>
  this_quant <- quantile(varname, c(.025, .25, .5, .75, .975), na.rm=T)
 detach(civilw)
  return(list(mean=this_mean, variance=this_var, quantiles=this_quant))
my_summary(polity2)
## $mean
## [1] -0.4130136
##
## $variance
## [1] 56.62469
##
## $quantiles
## 2.5%
           25%
                 50%
                        75% 97.5%
##
     -10
           -7 -3
                        8
polity2_summary <- my_summary (polity2)</pre>
str(polity2_summary)
## List of 3
## $ mean
           : num -0.413
## $ variance : num 56.6
## $ quantiles: Named num [1:5] -10 -7 -3 8 10
    ..- attr(*, "names")= chr [1:5] "2.5%" "25%" "50%" "75%" ...
```

2.6: A note on classes

If you run ?1m, doesn't it look like it is returning a list?

```
library(foreign)
civilw <- read.dta("repdata.dta")</pre>
lm1 <- lm(polity2 ~ gdpen, data=civilw)</pre>
str(lm1) # it looks like a really complicated list
## List of 13
## $ coefficients : Named num [1:2] -2.743 0.655
    ..- attr(*, "names") = chr [1:2] "(Intercept)" "gdpen"
## $ residuals : Named num [1:6343] 7.75 7.73 7.49 7.33 7.48 ...
## ..- attr(*, "names") = chr [1:6343] "1" "2" "3" "4" ...
## $ effects
                 : Named num [1:6343] 26.17 -228.39 7.3 7.13 7.29 ...
   ..- attr(*, "names")= chr [1:6343] "(Intercept)" "gdpen" "" "" ...
##
## $ rank
                  : int 2
## $ fitted.values: Named num [1:6343] 2.25 2.27 2.51 2.67 2.52 ...
    ..- attr(*, "names")= chr [1:6343] "1" "2" "3" "4" ...
##
## $ assign
                  : int [1:2] 0 1
```

```
:List of 5
## $ ar
    ..$ qr : num [1:6343, 1:2] -79.643 0.0126 0.0126 0.0126 0.0126 ...
    ... - attr(\star, "dimnames")=List of 2
     ....$: chr [1:6343] "1" "2" "3" "4" ...
##
##
    ....$ : chr [1:2] "(Intercept)" "gdpen"
    ....- attr(\star, "assign")= int [1:2] 0 1
##
    ..$ qraux: num [1:2] 1.01 1.01
##
     ..$ pivot: int [1:2] 1 2
##
##
    ..$ tol : num 1e-07
##
    ..$ rank : int 2
##
    ..- attr(*, "class") = chr "qr"
   $ df.residual : int 6341
##
## $ na.action :Class 'omit' Named int [1:267] 111 158 159 160 161 162 163 164 165 16
    .... attr(*, "names")= chr [1:267] "111" "158" "159" "160" ...
                 : Named list()
## $ xlevels
##
   $ call
                  : language lm(formula = polity2 ~ gdpen, data = civilw)
                 :Classes 'terms', 'formula' language polity2 ~ gdpen
##
   $ terms
    ....- attr(*, "variables") = language list(polity2, gdpen)
     .. ..- attr(*, "factors") = int [1:2, 1] 0 1
##
##
    .. .. - attr(*, "dimnames")=List of 2
    .....$ : chr [1:2] "polity2" "gdpen"
##
    .. .. ... $ : chr "gdpen"
    ....- attr(*, "term.labels") = chr "gdpen"
##
    \dots attr(*, "order")= int 1
##
##
    ....- attr(*, "intercept") = int 1
    .. ..- attr(*, "response") = int 1
##
    ....- attr(*, ".Environment") = <environment: R_GlobalEnv>
##
    ....- attr(*, "predvars") = language list(polity2, gdpen)
##
    ... - attr(*, "dataClasses") = Named chr [1:2] "numeric" "numeric"
    .... attr(*, "names") = chr [1:2] "polity2" "gdpen"
##
##
                  :'data.frame': 6343 obs. of 2 variables:
##
    ..$ polity2: num [1:6343] 10 10 10 10 10 10 10 10 10 ...
##
    ..$ gdpen : num [1:6343] 7.63 7.65 8.02 8.27 8.04 ...
     ..- attr(*, "terms")=Classes 'terms', 'formula' language polity2 ~ gdpen
##
##
    .... attr(*, "variables") = language list(polity2, gdpen)
    ..... attr(*, "factors") = int [1:2, 1] 0 1
##
    ..... attr(*, "dimnames")=List of 2
    .....$ : chr [1:2] "polity2" "gdpen"
##
##
    ..... s: chr "gdpen"
    .. .. - attr(*, "term.labels") = chr "gdpen"
##
    \dots attr(*, "order") = int 1
##
    .. .. ..- attr(*, "intercept") = int 1
##
    .. .. ..- attr(*, "response") = int 1
##
    ..... attr(*, ".Environment") = <environment: R_GlobalEnv>
##
    .. .. - attr(*, "predvars") = language list(polity2, gdpen)
##
    .... attr(*, "dataClasses") = Named chr [1:2] "numeric" "numeric"
##
    .. .. .. attr(*, "names") = chr [1:2] "polity2" "gdpen"
##
    ..- attr(*, "na.action")=Class 'omit' Named int [1:267] 111 158 159 160 161 162 163
    .... attr(*, "names")= chr [1:267] "111" "158" "159" "160" ...
## - attr(*, "class") = chr "lm"
lm1[[1]] # it acts like a list
## (Intercept)
                    gdpen
```

```
lm1$coefficients
## (Intercept)
                      gdpen
## -2.7429009
                  0.6550537
lm1["coefficients"]
## $coefficients
## (Intercept)
                      gdpen
   -2.7429009
                  0.6550537
class(lm1) # But it's not a list
## [1] "lm"
This is an object in the "lm" class. In this case, it works mostly like a list. Mostly this is because some
functions will work differently for objects of different classes
print(lm1)
##
## Call:
## lm(formula = polity2 ~ gdpen, data = civilw)
##
## Coefficients:
## (Intercept)
                       gdpen
       -2.7429
                       0.6551
# print(unclass(lm1)) # that's all of the raw data
R offers the ability to modify functions based on the class of an object
methods(class = "lm") # these are functions that do something different for the class lm t.
##
    [1] add1
                         alias
                                         anova
                                                         case.names
    [5] coerce
                        confint
##
                                         cooks.distance deviance
##
   [9] dfbeta
                        dfbetas
                                         drop1
                                                         dummy.coef
## [13] effects
                        extractAIC
                                         family
                                                         formula
## [17] hatvalues
                        influence
                                         initialize
                                                         kappa
## [21] labels
                        logLik
                                         model.frame
                                                         model.matrix
## [25] nobs
                                         predict
                        plot
                                                         print
## [29] proj
                                         residuals
                                                         rstandard
                         qr
## [33] rstudent
                        show
                                         simulate
                                                         slotsFromS3
## [37] summary
                        variable.names vcov
## see '?methods' for accessing help and source code
methods (plot) # These are all the variants of the function plot. For each of these classes
##
    [1] plot.acf*
                              plot.data.frame*
                                                    plot.decomposed.ts*
   [4] plot.default
                                                    plot.density*
##
                              plot.dendrogram*
##
   [7] plot.ecdf
                              plot.factor*
                                                    plot.formula*
## [10] plot.function
                                                   plot.histogram*
                              plot.hclust*
## [13] plot.HoltWinters*
                              plot.isoreg*
                                                    plot.lm*
## [16] plot.medpolish*
                              plot.mlm*
                                                   plot.ppr*
## [19] plot.prcomp*
                              plot.princomp*
                                                    plot.profile.nls*
## [22] plot.raster*
                                                    plot.stepfun
                              plot.spec*
## [25] plot.stl*
                              plot.table*
                                                    plot.ts
## [28] plot.tskernel*
                              plot.TukeyHSD*
## see '?methods' for accessing help and source code
```

2.7: A note on scope

As we noted – local variables are not written into the global environment. Unless you are to the point where you are creating your own namespaces (in which case you can explain all of that to me), you don't need to worry much about scope except to understand that:

```
# What happens in the function, stays in the function
f <-function() {</pre>
  x \leftarrow 1 \#local x
  g()
  return(x)
g<-function() {</pre>
  x<-2 # local x
f()
## [1] 1
x<-3 # global x
## [1] 1
X
## [1] 3
# HOWEVER: you can pass values downwards in a function chain
f <-function() {</pre>
  x<- 1
  y < -g(x)
  return(c(x, y))
g<-function(x){
  x+2
f()
## [1] 1 3
```