1 Start R

- run GUI
- change working directory on GUI
 - quicklaunch icon>preferences>start in, type path there
 - R console>file/change dir
- alternative, 2-in-1 on command prompt: go into work dir and give command "R"
- help facilities
 - start them all from typing on R console:
 - help.start() HTML help
 - help(keyword), ??keyword, help.search(keyword) sometimes needs to be enclosed in " " (double quotes)
- have separate subfolders for sessions/projects!! as data and history will be saved in unnamed .Rdata and .Rhistory files all work objects are saved!
- reusable code can be saved into .R script files, run them with GUI or source("filename.R")
- R console...
 - in editor, you can use arrow keys, up and down to browse previous commands, left and right to go back and edit (can't highlight and replace but can delete and insert characters)
 - .Last.value variable stores last output
 - calculation only prints output, assignment saves but doesn't print(!)
- packages
 - list installed packages with library()
 - access help with ?package.name
 - load package with library(package.name) (attach to search path)

- open previous workspace: file>load workspace and find the .Rdata file; or open the .Rdata file directly from Windows – makes available the objects and command history with arrows (will not print console log)
- console log must be saved *separately* with file>save to file

2 Data structures

2.1 Symbols, operators

- objects
 - in R's head, everything is an object variables, user defined functions, etc.
 - many functions, analysis etc. give back complex objects, and we can get data out of them with more functions
 - good practice: do not overclutter the workspace, as all objects are kept in memory, as well as saved in save files!
 - object attributes
 - * mode(): data type, character, number, logical, etc.
 - * length(): length
 - * attributes(): all other attributes
 - * logical function to check mode: is.character()
 - * coercing into given mode: as.character()
 - * change given attribute attr(object, attribute name)=
 - * class: goes beyond mode, allows for object oriented programming, specific printing functions for different object types, etc.
 - * temporarily remove class with unclass()
 - * ls() or objects() lists current objects
 - * delete and free up memory with rm() or remove(), list object names to remove in argument
- special symbols
 - comment: $\#-{\rm can}$ be used almost anywhere, effect till end of line

- () is used for function arguments
- [] or [[]] is used for accessing elements of vectors, matrices etc.
- several commands in one line separated by ;
- grouping with {}
- accessing a named element/component with \$
- variable and function names
 - can contain a-zA-Z0-9._ (dot and undesrscore)
 - function names have . where most languages would have _ !
 - R is case sensitive!
- assignment of value
 - x < expr
 - $\exp r \rightarrow x$
 - $-x = \exp(\text{not common!})$
- possible values
 - numbers integer, double (=double precision floating point), complex (e.g. 2-3i)
 - characters and character vectors ("strings") C type strings, 0 terminated, has \n, \t, etc.
 - logical types: TRUE, FALSE, NA (not available, missing data), NaN (not a number, e.g. 0/0 = ??)
- logical relational operators
 - -<, >, <=, >= as usual
 - != not equal, == is it equal
 - -%in% is it in the set
 - is.na() is it NA TRUE for both NA and NaN always use this for checking NA values!! == gives silly answers
 - is.nan() only TRUE for NaN

- operators on logical expressions
 - & and, or, ! negation, xor(), and use ()'s to group all binary!
 - of longer vectors, use any() and all() instead of and &

2.2 Vectors

- most basic and common
- a variable is a 1-element vector too
- all elements of same type numbers may be coerced into characters
- for different types, need lists see later
- create vector
 - with concatenation function c(), e.g. c(2,5,3,-2)
 - algebraic series with seq()
 - * 4 arguments, but only 3 needed
 - * from: from=, or unnamed at pos 1
 - * to: to=, or unnamed at pos 2
 - * stepsize: by=
 - * length, total number of elements: len= or length=
 - -: syntax e.g. 2:5 = all numbers from 2 to 5, shorthand for seq(2,5,by=1) has high precedence in order of operations
- how operators work on vectors
 - operators and functions are always applied *elementwise*!
 - vectors of different length are allowed, the shorter will be recycled as many times as needed
- maths operators
 - -+, -, *, / as usual (division gives floating point numbers)
 - power: $\hat{}$ or **
 - div, whole division %/%

- mod, remainder %%
- has some built-in functions, such as
 - * elemtwise: sqrt(), sin(), cos(), tan(), log(), exp(), abs()
 - * "scalars": min, max
 - $* \text{ range} = c(\min, \max)$
 - * pmin, pmax: select min and max of each vector separately for several inputs
 - * scalars: sum, prod, mean, var (adjusted empirical variance!), length
- sort vector with sort()
- access and replace elements
 - access with [] by index, or by name if it's defined
 - replace with vector[index] =
 - can be used to add new elements too (missing in between indices are filled with NA)
 - access several elements with : or c()
 - c(), or external index vector can be used to take elements out of order as well, possibly with repetition, possibly resulting in a longer vector than original etc.
 - take everything but given elements with -: or -c()
 - that's what we use for "removal" as well (no specific function to remove) and save as new variable/replace old
 - or manually set length() shorter to cut off the end of the vector
 - can also select elements by logical condition(s) with vector[(condition)]
 - can select elements with sticking a logical vector in [] as well logical vector will be repeated as many times as needed
- combine and repeat vectors
 - concatenation with c()
 - rep(vector,times=2) concatenate with itself 2 times
 - rep(vector,each=2) repeat *elementwise* 2 times
 - paste(string1, string2, sep=) more or less outer product of the character vectors; default separator is space

2.2.1 Factors

- a factor represents a *categoric* variable, that is, a finite selection of values are allowed and it's meant for grouping rather than calculations
- a factor can be ordered or unordered e.g. grades would be ordered, but counties would not
- order is given by sorting, e.g. increasing numbers of alphabetical order of strings
- convert a variable into a factor with factor() handled differently internally, printed differently, etc.
- levels() queries the created categories/possible values of the factor
- factors and tapply(data,factor,function) allow us to split data according to categories and make calculations
 - assuming data and factor are vectors of the same length and the same index pairs are data records
 - tapply splits the data into subvectors according to factor and then applies function to each subvector
 - usage example: data contains height of students, factor contains their sex (in the same order), and we want to calculate average height of boys and girls separetely
 - the combination of data + factor here can be thought of as a ragged array: categories may be of different size
- create ordered factor of a vector with the function ordered() in case a natural ordering exists, e.g. numerical grades
- cut continuous data into categories
 - $\operatorname{cut}(\operatorname{data,breaks}),$ where
 - either breaks=integer to determine how many categories should be created
 - or breaks=vector that contains the cut points
 - optional argument: ordered_result=TRUE, make the result an ordered factor

- automatic labels with the resulting intervals
- frequency table: table(factor)
- can be used for two- or more-way frequencies by passing more factor arguments

2.2.2 Array, matrix

- similar to vectors, elements of same mode, but may have multiple indices \sim multiple dimensions, matrix is specifically 2-dim, array can be higher dimensional
- coerce/convert a vector into e.g. an $n \times m$ matrix by defining its dimensions: dim(v) = c(n,m) v must have exactly nm elements!
- default: filled by columns(!) matrix can have byrow=TRUE argument to fill by row
- create them: matrix(data,nrow,ncol), array(data,dim) data is vector (will be repeated if necessary)
- elements can be accessed with multiple indeces: v[i,j] (i $\leq n, j \leq m$)
- \bullet omitted index means "take all", get entire rows and columns with v[i,] and v[,j]
- we can use c() or : to select multiple rows/columns result is an array of all intersections of selected rows and columns
- single index (or c() or :) returns values of the *underlying vector*
- for a 2-dim array, a 2-column index array can be used for indexing: each row is taken as the i,j coordinates of an element, and thus a vector of elements can be queried or overwritten
- matrix operations
 - size: nrow(), ncol()
 - matrix multiplication %*% works for matrix times vector as well

- * for vector %*% vector, it's ambiguous! usually taken to be inner product; one vector can be forced to column or row with cbind() or rbind(); but crossprod() and outer() is recommended
- transpose t()
- crossprod(x,y) = t(x) %*% y, but more efficient; crossprod(x) = crossprod(x,x)
- diag(matrix) = vector of diagonal entries; diag(vector) = generate diagonal matrix with values of vector; diag(n) where n is number: n×n identity matrix (!)
- solve(A,b): calculates solution x of Ax=b LEQ; solve(A) calculates inverse of A (!) but it's counterrecommended, inefficient
- eigenvalues: eigen(matrix), contains named variables "values" and "vectors" in a list – get named components with \$, e.g. ev = eigen(A); evalues = ev\$values
- determinant: det()
- singular value decomposition svd(A), gives a named list of "u", "d" and "v"
- array arithmetic
 - default for the basic operators: element by element operations(!!)
 - outer product: A %o% B, outer(A,B,"*"), more generally outer(A,B,function)
 - generalized transpose: for array, aperm(array,permutation) shuffles the dimensions according to permutation (which must be permutation of number of dimensions)
- concatenate matrices and arrays
 - cbind(arr1,arr2) concatenates them as consisting of column vectors, side by side – they must have same number of rows
 - rbind() analogously with row vectors
 - c() strips back data into vector form to concatenate!

3 List, data frame

3.1 List

- list: vector-like object, but elements need not be of same mode, and they may be named (think Python dictionary)
- elements can always be referred to by number
- elements may even be lists recursive type
- create list with list(name1=element1,unnamed element,...) (similar to c() except for the names)
- refer to single elements (only the dictionary value!) by list[[index]] or list[["name"]] or list\$name in list[["name"]] syntax, "name" can be read from a character vector
- the [] syntax also works, but with different effect e.g. brings the elements name (dictionary key) with it
- if an element is a list/vector/array, add another [index] to access its sub-elements
- names(list) is an overwritable attribute of the list containing the element names
- concatenate lists with c(), result is list again

3.2 Data frame

- data frame (mode data.frame) is a crossover between matrix and list
- well suited to record experiment data, measurement/data type per column and experiment per row
- its columns are vectors, aka must be the same type (may contain NAs), and they may be named
- rows may be named, by default indexed by positive integers
- data frames are built column by column, data sources may be:

- vectors, factors
- matrices
- other data frames
- lists of named vectors/factors
- can use several, but sizes must match (vector/factor lengths and nomber of rows in matrixes)
- maximal information is inherited (e.g. column names from source data frame)
- create with data.frame(list of sources,name=vector,...)
- optional argument for naming rows: row.names=
 - default NULL, rows are automatically numbered
 - single column index or column name to take row names from
 - vector of numbers or character vectors to use
- coerce another structure into data frame with as.data.frame()
- little namespace trickery
 - having to type my.data.frame\$column.name gets tedious
 - attach("my.data.frame") adds my.data.frame to the search path of looking for variables – aka it's enough to type column.name to *read* the variable (for writing, we still need \$!)
 - detach("my.data.frame") removes it from the search path to "hide" the variables/columns again
 - can also attach lists to make named components visible
 - check search path with search()
 - detach() works with position number as well
 - ls(position number) lists variable names in the given namespace
- accessing elements and modifying data frames
 - access columns with my.data.frame\$column.name or with index
 - access rows with my.data.frame[index,]

- access single elements with double index can use index or row/column name too
- can always add new column with my.data.frame\$new.column.name
 =
- can redefine column with same syntax, e.g. turn vector into factor
- add new rows:
 - * my.data.frame[index,] or my.data.frame["row.name",] = list(...)
 - * the comma is important, as a single index number will give back column instead of row!
 - * if existing index or "row.name" is given, the row is overwritten (!)
 - * if "row.name" is new, attached at the bottom
 - $\ast\,$ if index is well out of range, extra rows with NA values are created
- graphically edit data frame like a spreadsheet with fix(my.data.frame) or edit(my.data.frame) can modify values, add columns, add rows, etc.
 difference: fix edits the original, while edit doesn't change the original, just returns a modified copy
- remove rows or columns: use indexing seen before at vectors/lists to select parts of the data frame, which can be saved as new data frame (or overwrite the old)
- external sources of data
 - read data from (suitably formatted) external file into a data frame with read.table("source.data")
 - * assuming a data frame format in the source file as well: first row is column headers, first element missing, other rows have row name as first element
 - * otherwise with optional argument header=TRUE just assume no row names but first row contains column headers
 - many datasets come with R itself, as predefined data frame objects!
 - data() command lists all available

- ?name.of.dataset opens online help with explanation of sample size, variables and interpretation
- or use fix()/edit() to take a look
- even more datasets available from other R packages
 - * load with data(dataset.name, package="package.name")
 - * or load/attach package with libary(package.name), then its dataset(s) become available