### **Basic of R language**

#### Dr. S. DEVAARUL

### Learning aims

- Basic use of R and R help
- How to give R commands
- R data structures
- Reading and writing data
- Some more R commands (exercises)

# R project

- "R is a free software environment for statistical computing and graphics" (http://www.r-project.org)
- "Bioconductor is a software project for the analysis of genomic data" (http://www.bioconductor.org)
  - Currently works as an expansion to R

### Packages

- R consists of a core and packages.
- Packages contain functions that are not available in the core.
- For example, Bioconductor code is distributed as several dozen of packages for R.
  - Software packages
  - Metadata (annotation) packages

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R 2.3.1 - A Language and Environment

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### Help - Search engine

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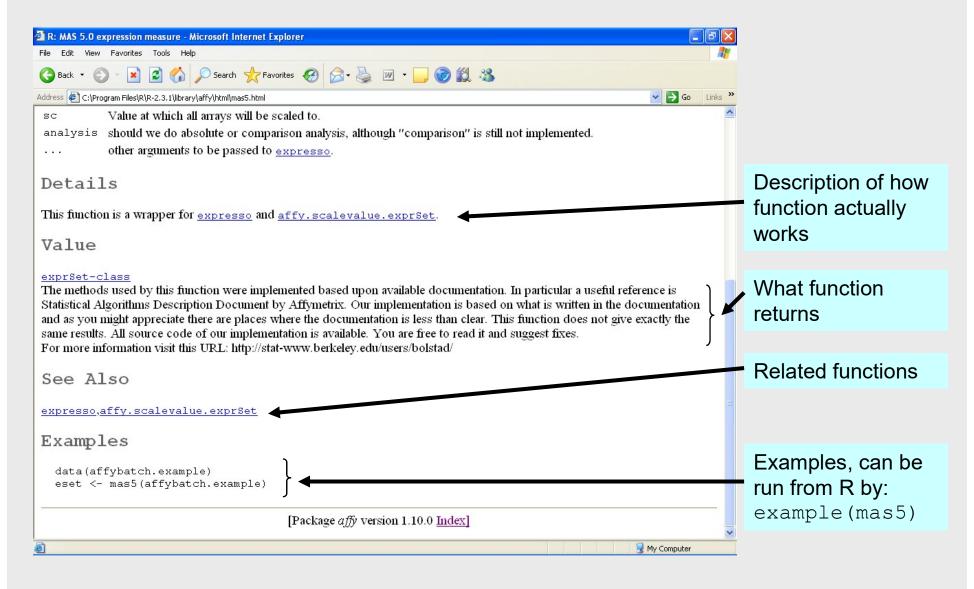
### Help - packages

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	basic R data types	User Guides and Package Vignettes					
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Biobase	Biobase: Base functions for Bioco	Read <u>overview</u> or browse <u>directory</u> .					
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<u>)</u>		cColor A function for marking specific probes on a cPlot.					
		closeHtmlPage Open and close an HTML file for writing.					
		connection-class Virtual S4 classes for method dispatching					
		<u>cPlot</u> A plotting function for chromosomes.					
		cScale A function for mapping chromosome length to a number of points.					
		CullACXPoints A function for plotting expression data from an express for a given chromosome.					

### Anatomy of a help file 1/2

🚰 R: MAS 5.0 expression measure - Microsoft Internet Explorer		
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mas5 {affy}	R Documentation	Function {package}
MAS 5.0 expression measure		
Description		Conoral description
This function converts an instance of <u>AffyBatch-class</u> into an instance of <u>exprSet-class</u> using our implement Affymetrix's MAS 5.0 expression measure.	ntation of	General description
Usage		Command and it's
mas5(object, normalize = TRUE, sc = 500, analysis = "absolute",)		argument
Arguments		Detailed description
object an instance of <u>AffyBatch-class</u>		of arguments
normalize logical. If TRUE scale normalization is used after we obtain an instance of exprSet-class         sc       Value at which all arrays will be scaled to.		
analysis should we do absolute or comparison analysis, although "comparison" is still not implemented.		
$\cdots$ other arguments to be passed to <u>expresso</u> .		
Details		
This function is a wrapper for <u>expresso</u> and <u>affy.scalevalue.exprSet</u> .		
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### Anatomy of a help file 2/2



#### Functions or commands in R 1/3

- To use a function in a package, the package needs to be loaded in memory.
- Command for this is library(), for example: library(affy)
- There are three parts in a command:
  - the command
  - brackets
  - Arguments inside brackets (these are not always present)

#### Functions or commands in R 2/3

- R is case sensitive, so take care when typing in the commands!
  - library(affy) works, but Library(affy) does
     not.
- Multiple commands can be written on the same line. Here we first remove missing values from the variable year, and then calculate it's arithmetic average.
  - Writing:
    - na.omit(year)
    - mean(year)
  - Would be the same as
    - mean(na.omit(year))

#### Functions or commands in R 3/3

- Command can have many arguments. These are always giving inside the brackets.
- Numeric (1, 2, 3...) or logic (T/F) values and names of existing objects are given for the arguments without quotes, but string values, such as file names, are always put inside quotes. For example:
- mas5(dat3, normalize=T, analysis="absolute")

### Data structures 1/6

- Vector
  - A list of numbers, such as (1,2,3,4,5)
  - -R:a<-c(1,2,3,4,5)
    - Command c creates a vector that is assigned to object a
- Factor
  - A list of levels, either numeric or string
  - -R:b<-as.factor(a)
    - Vector a is converted into a factor

### Data structures 2/6

- Data frame
  - A table where columns can contain numeric and string values
  - -R: d < -data.frame(a, b)
- Matrix
  - All columns must contain either numeric or string values, but these can not be combined
  - -R:e<-as.matrix(d)
    - Data frame d is converted into a matrix e
  - R: f<-as.data.frame(e)</pre>
    - Matrix e is converted into a dataframe f

### Data structures 3/6

- List
  - Contains a list of objects of possibly different types.
  - R: g<-as.list(d)</pre>
    - Converts a data frame d into a list g
- Class structures
  - Many of the Bioconductor functions create a formal class structure, such as an AffyBatch object.
  - They contain data in slots
  - Slots can be accessed using the @-operator:
    - dat2@cdfName

### Data structures 4/6

- Some command need to get, for example, a matrix, and do not accept a data frame. Data frame would give an error message.
- To check the object type:
  - R: class(d)
- To check what fields there are in the object:
  - **R:** d
  - R: str(d)
- To check the size of the table/matrix:
  - R: dim(d)
- To check the length of a factor of vector:
  - R: length(a)

### Data structures 5/6

- Some data frame related commands:
  - R: names (d)
    - Reports column names
  - R: row.names(d)
    - Reports row names
- These can also be used for giving the names for the data frame. For example:
  - R: row.names(d) <-c("a", "b", "c", "d", "e")</p>
    - Letters from a to e are used as the row names for data frame d
    - Note the quotes around the string values!
  - R: row.names(d)

### Data structures 5/6

- Naming objects:
  - Never use command names as object names!
  - If your unsure whether something is a command name, type to the comman line first. If it gives an error message, you're safe to use it.
  - Object names can't start with a number
  - Never use special characters, such as å, ä, or ö in object names.
  - Underscore (\_) is not usable, use dot (.) instead:
    - Not acceptable: good\_data
    - Better way: good.data
  - Object names are case sensitive, just like commands

### Reading data 1/2

- Command for reading in text files is: read.table("suomi.txt", header=T, sep="\t")
- This examples has one command with three arguments: file name (in quotes), header that tells whether columns have titles, and sep that tells that the file is tab-delimited.

### Reading data 2/2

 It is customary to save the data in an object in R. This is done with the assignment operator (<-):</li>

dat<-read.table("suomi.txt", header=T, sep="\t")</pre>

- Here, the data read from file suomi.txt is saved in an object dat in R memory.
- The name of the object is on the left and what is assigned to the object is on the right.
- Command read.table( ) creates a data frame.

### Using data frames

- Individual columns in the data frame can be accessed using one of the following ways:
  - Use its name:
    - dat\$year
    - dat is the data frame, and year is the header of one of its columns.
       Dollar sign (\$) is an opertaor that accesses that column.
  - Split the data frame into variables, and use the names directly:
    - attach(dat)
    - year
  - Use subscripts

## Subscripts 1/2

- Subscripts are given inside square brackets after the object's name:
  - -dat[,1]
    - Gets the first column from the object dat
  - -dat[,1]
    - Gets the first row from the object dat
  - -dat[1,1]
    - Gets the first row and it's first column from the object dat
- Note that dat is now an object, not a command!

### Subscripts 2/2

- Subscripts can be used for, e.g., extracting a subset of the data:
  - dat[which(dat\$year>1900),]
    - Now, this takes a bit of pondering to work out...
    - First we have the object dat, and we are accessing a part of it, because it's name is followed by the square brackets
    - Then we have one command (which) that makes an evaluation whether the column year in the object dat has a value higher than 1900.
    - Last the subscript ends with a comma, that tells us that we are accessing rows.
    - So this command takes all the rows that have a year higher 1900 from the object dat that is a data frame.

## Writing tables

- To write a table:
  - write.table(dat, "dat.txt", sep="\t")
  - Here an object dat is written to a file called dat.txt. This file should be tab-delimited (argument sep).
- To capture what is written on the screen:
  - sink("output.txt")
  - dat
  - sink( )
  - Here, output written on the screen should be written to a file output.txt instead. Contents of the object dat are written to the named file. Last, the file is closed.
  - Note that if you accidentally omit the last command, you'll not be able to see any output on the screen, because output is still redirected to a file!

# Quitting R

- Use command q() or menu choise File->Exit.
- R asks whether to save workspace image. If you do, all the object currently in R memory are written to a file .Rdata, and all command will be written a file .Rhistory.
- These can be loaded later, and you can continue your work from where you left it.
- Loading can be done after starting R using the manu choises File->Load Workspace and File-> Load History.

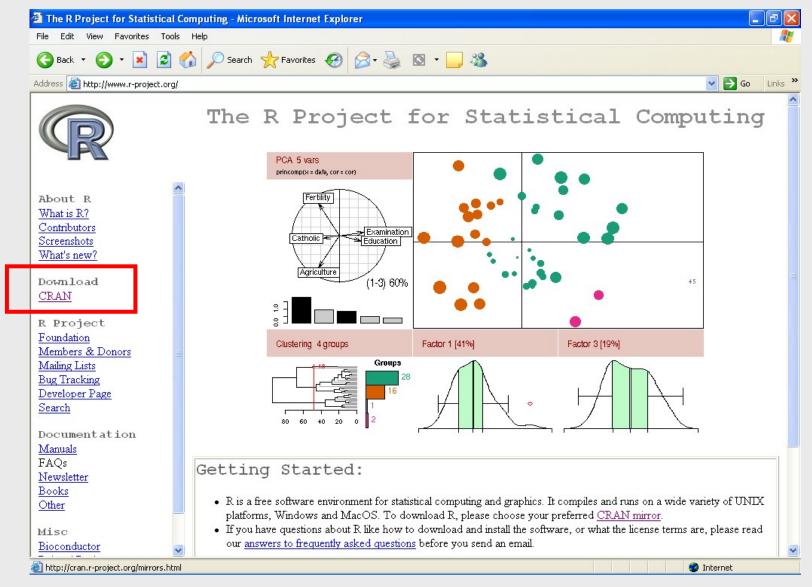
### In summary 1/2

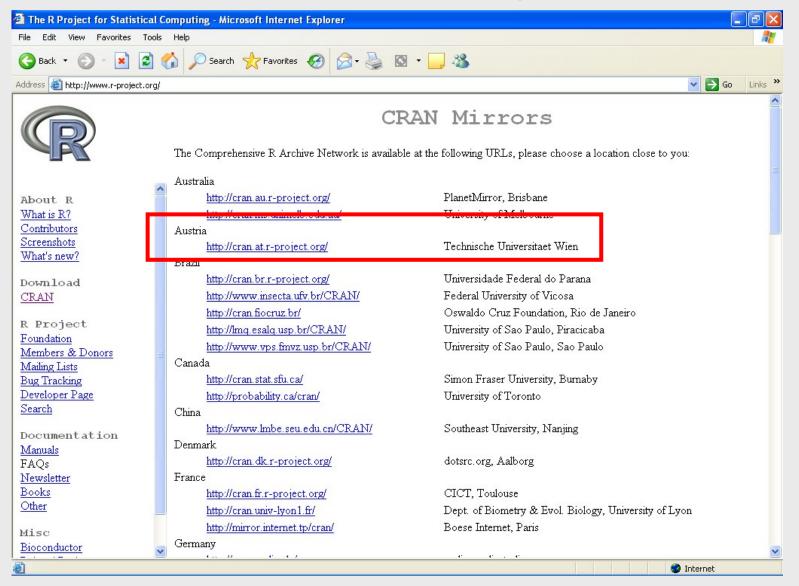
- Commands can be recognized from the brackets "()" that follow them. If you calculate how many bracket pairs there are, you'll be able to identify the number of commands.
  - pData(dat)<-pd</pre>
- Assignment to an object is denoted by "<-" or "->" or "=". If you see a notation "= =", you'll looking at a comparison operator.
  - Many other notations can be found from the documentation for the Base package or R.
- Table-like objects are often followed by square brackets "[]". Square never associate with commands, only objects.
  - dat[,1]
- Special characters \$ and @ are used denoting individual columns in a data frame or an individual slot in a class type of an object, respectively.
  - dat\$year
  - dat2@cdfName

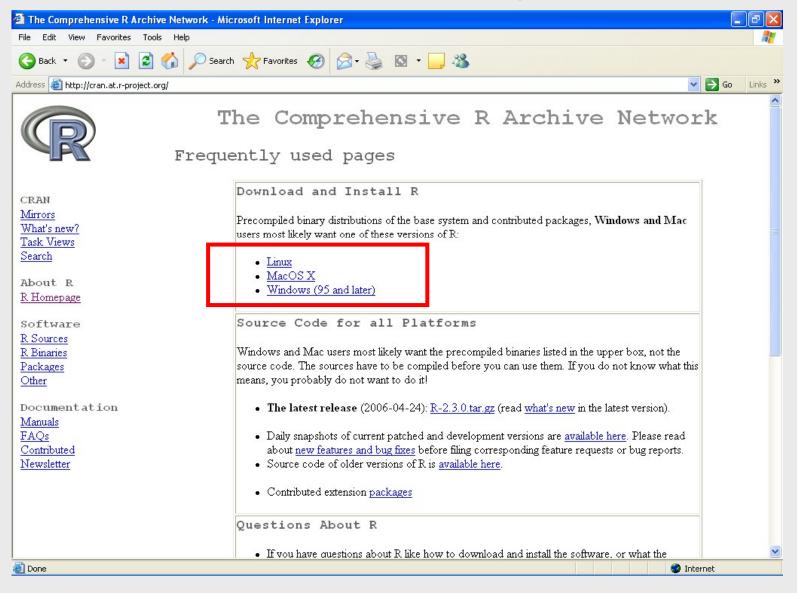
### In summary 2/2

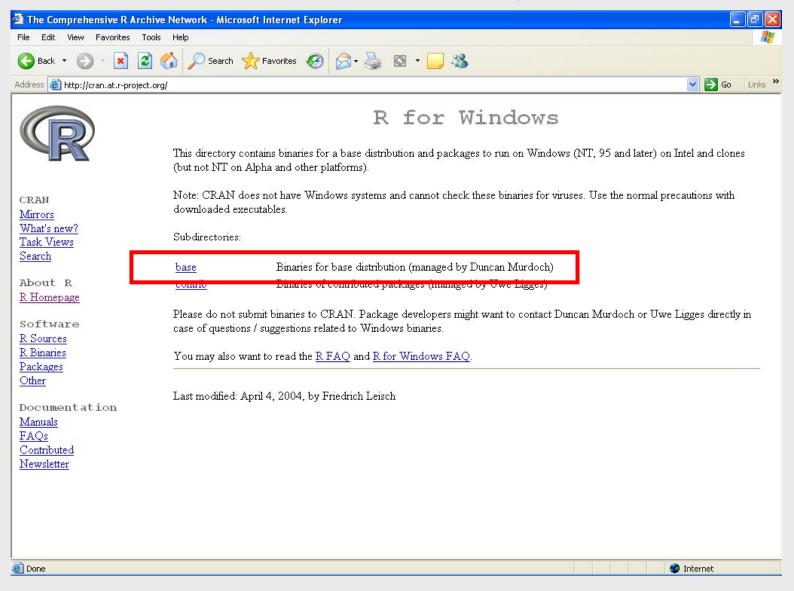
- If you encounter a new command during the exercises, and you'd like to know what it does, please consult the documentation. All R commands are listed nowhere, and the only way to get to know new commands is to read the documentation files, so we'd like you to practise this youself.
- You'll probably see command and notations that were not introduced in this talk. This in intentional, because we thought that these things are best handled on a situational basis. In such cases, please ask for more clarifications if needed.
- If you run into problems, please ask for help from the teachers. That's why we are here!

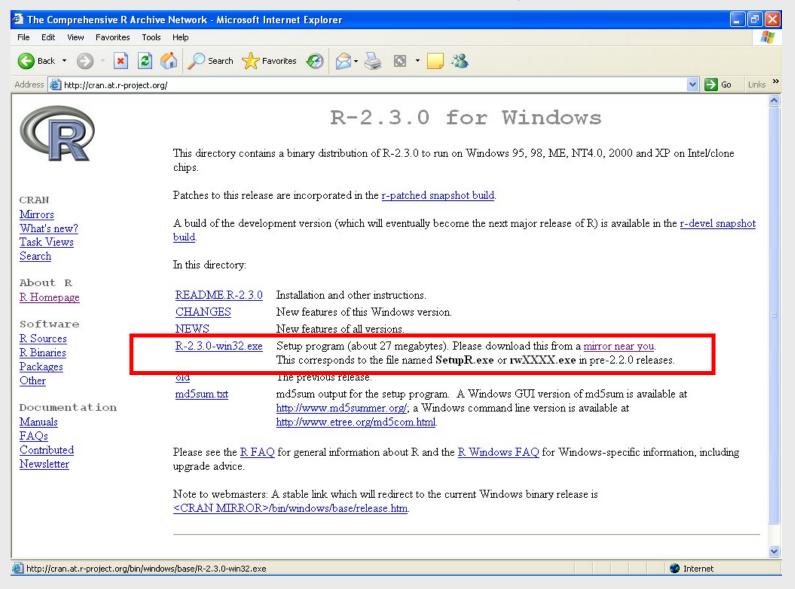
# Installing R







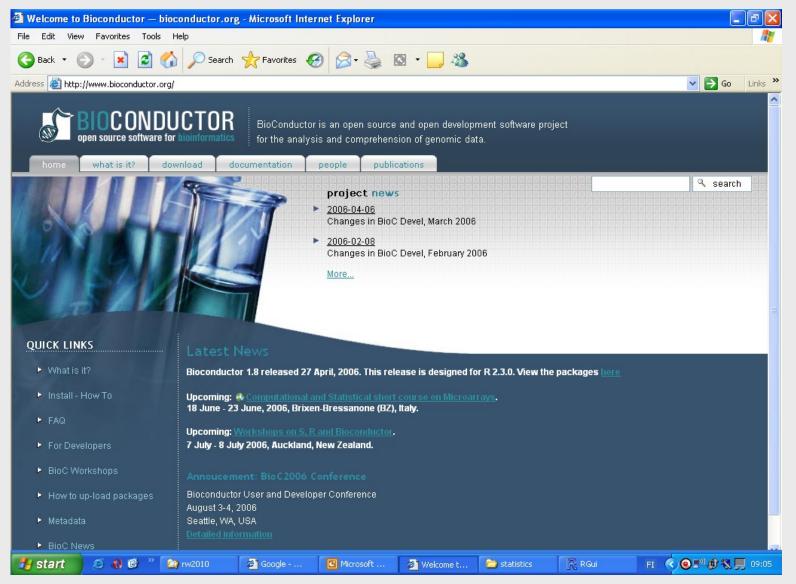


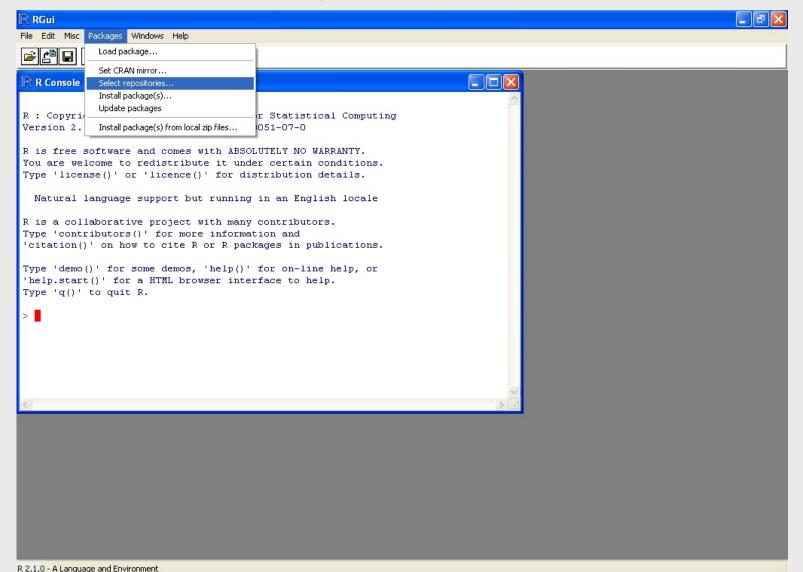


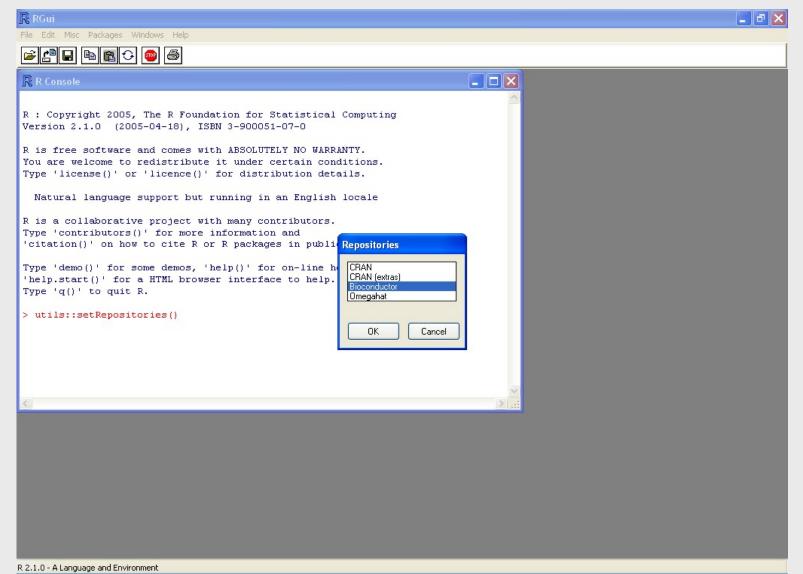
## Installing R for Windows

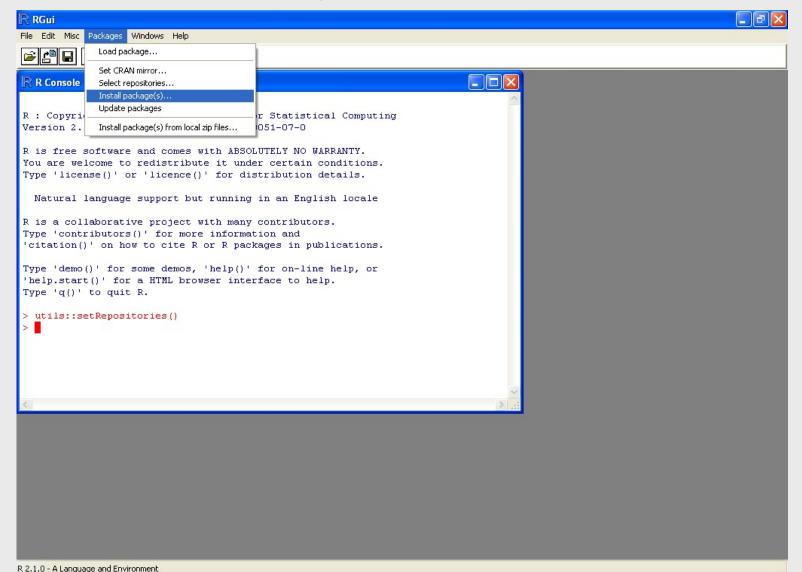
- Execute the R-2.3.0-win32.exe with administrator privileges
- Once the program is installed, run the R program by clicking on its icon
- R 2.2.1 with Bioconductor 1.7.0 is installed on corona.csc.fi, also
- R 2.3.1 is in works

### **Downloading Bioconductor**









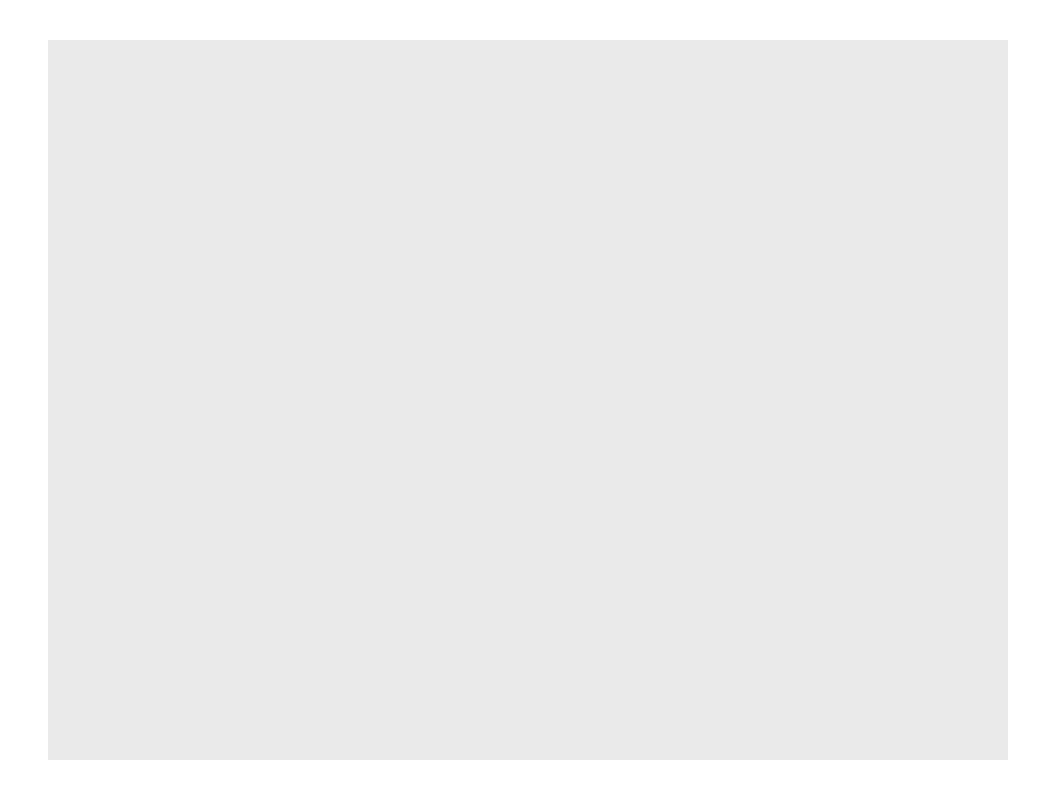
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#### Installing Bioconductor (the best way)

 Alternatively, you can install Bioconductor using a script:

source("http://www.bioconductor.org/biocLite.R")
biocLite()

```
biocLite(c(" "hgu133a", "hgu133acdf",
    "hgu133aprobe", "ygs98", "ygs98cdf",
    "ygs98probe")
```



#### Linear Models & Descriptive Statistics

- Has functions for all common statistics
- summary() gives lowest, mean, median, first, third quartiles, highest for numeric variables
- stem() gives stem-leaf plots
- table() gives tabulation of categorical variables

# **Basics**

- Highly Functional
  - Everything done through functions
  - Strict named arguments
  - Abbreviations in arguments OK (e.g. T for TRUE)
- Object Oriented
  - Everything is an object
  - " < " is an assignment operator</p>
  - "X <- 5": X GETS the value 5</p>

#### **Data Structures**

- Supports virtually any type of data
- Numbers, characters, logicals (TRUE/ FALSE)
- Arrays of virtually unlimited sizes
- Simplest: Vectors and Matrices
- Lists: Can Contain mixed type variables
- Data Frame: Rectangular Data Set

### Data Structure in R

	Linear	Rectangular
All Same Type	VECTORS	MATRIX*
Mixed	LIST	DATA FRAME

## **Reading Data: summary**

- Directly using a vector e.g.: x <- c(1,2,3...)</li>
- Using scan and read.table function
- Using matrix function to read data matrices
- Using data.frame to read mixed data
- library(foreign) for data from other programs

## **Accessing Variables**

- edit(<mydataobject>)
- Subscripts essential tools
  - -x[1] identifies first element in vector x
  - -y[1,] identifies first row in matrix y
  - -y[,1] identifies first column in matrix y
- \$ sign for lists and data frames
  - myframe\$age gets age variable of myframe
  - attach(dataframe) -> extract by variable name

#### Subset Data

- Using subset function
  - subset() will subset the dataframe
- Subscripting from data frames

   myframe[,1] gives first column of myframe
- Specifying a vector

   myframe[1:5] gives first 5 rows of data
- Using logical expressions
  - myframe[myframe[,1], < 5,] gets all rows of the first column that contain values less than 5

# Graphics

- Plot an object, like: plot(num.vec)
  - here plots against index numbers
- Plot sends to graphic devices
  - can specify which graphic device you want
    - postscript, gif, jpeg, etc...
    - you can turn them on and off, like: dev.off()
- Two types of plotting
  - high level: graphs drawn with one call
  - Low Level: add additional information to existing graph

## **Programming in R**

- Functions & Operators typically work on entire vectors
- Expressions surrounded by {}
- Codes separated by newlines, ";" not necessary
- You can write your own functions and use them

## **Statistical Functions in R**

- Descriptive Statistics
- Statistical Modeling
  - Regressions: Linear and Logistic
  - Probit, Tobit Models
  - Time Series
- Multivariate Functions
- Inbuilt Packages, contributed packages

## **Descriptive Statistics**

- Has functions for all common statistics
- summary() gives lowest, mean, median, first, third quartiles, highest for numeric variables
- stem() gives stem-leaf plots
- table() gives tabulation of categorical variables

# Statistical Modeling Over 400 functions

- -Im, gIm, aov, ts
- Numerous libraries & packages

   survival, coxph, tree (recursive trees), nls, …
- Distinction between factors and regressors
  - factors: categorical, regressors: continuous
  - you must specify factors unless they are obvious to R
  - dummy variables for factors created automatically
- Use of data.frame makes life easy

# How to model

- Specify your model like this:
  - $-y \sim x_i + c_i$ , where
  - -y = outcome variable, x<sub>i</sub> = main explanatory variables, c<sub>i</sub> = covariates, + = add terms
  - -Operators have special meanings
    - + = add terms, : = interactions, / = nesting, so on...
- Modeling -- object oriented
  - -each modeling procedure produces

## **Synopsis of Operators**

Operato	Usually means	In Formula means
<sup>r</sup> f or -	add or subtract	add or remove terms
*	multiplication	main effect and
1	division	interactions Main effect and nesting
:	sequence	interaction only
۸	exponentiation	limiting interaction
%in%	no specific	depths nesting only

# Modeling Example: Regression

carReg <- Im(speed~dist, data=cars)</pre>

carReg = becomes an object

- to get summary of this regression, we type
- summary(carReg)
- to get only coefficients, we type

coef(carReg), or carReg\$coef

- don't want intercept? add 0, so
- carReg <- Im(speed~0+dist, data=cars)

# **Multivariate Techniques**

- Several Libraries available
  - -mva, hmisc, glm,
  - MASS: discriminant analysis and multidim scaling
- Econometrics packages
  - dse (multivariate time series, state-space models), ineq: for measuring inequality, poverty estimation, its: for irregular time series, sem: structural equation modeling, and so on...

[http://www.mayin.org/ajayshah/]

# Summarizing...

- Effective data handling and storage
- large, coherent set of tools for data analysis
- Good graphical facilities and display
  - on screen
  - on paper
- well-developed, simple, effective programming