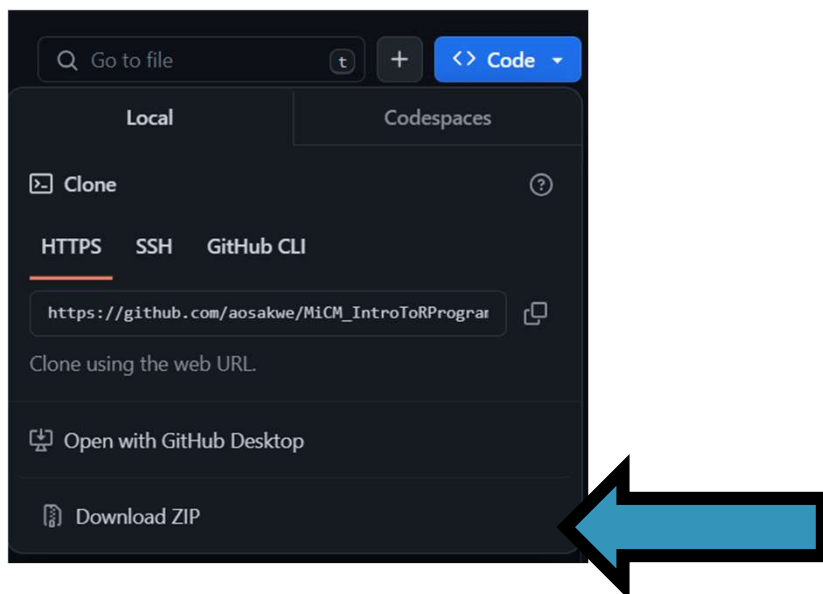
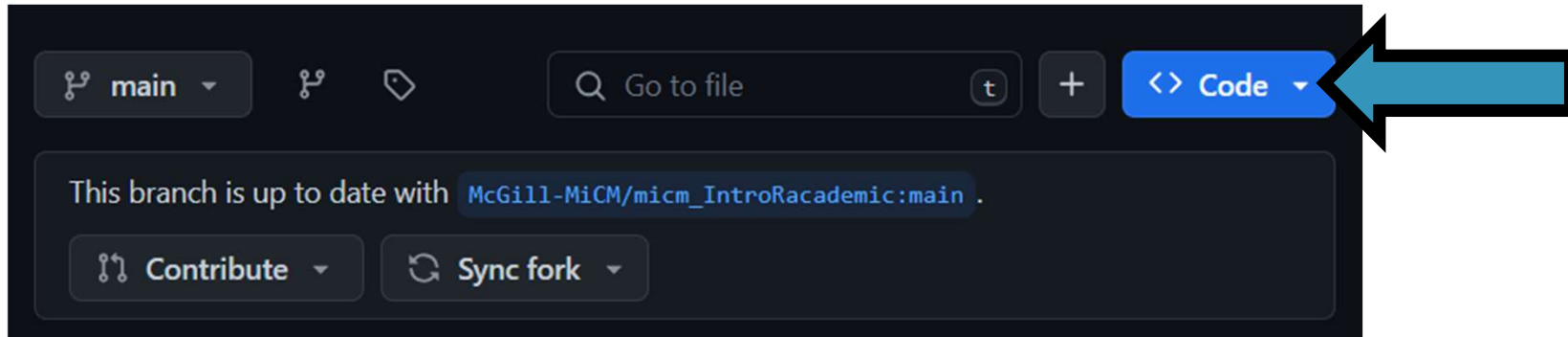


Download Workshop Materials

1. Go to https://github.com/aosakwe/MiCM_IntroToRProgramming

2.



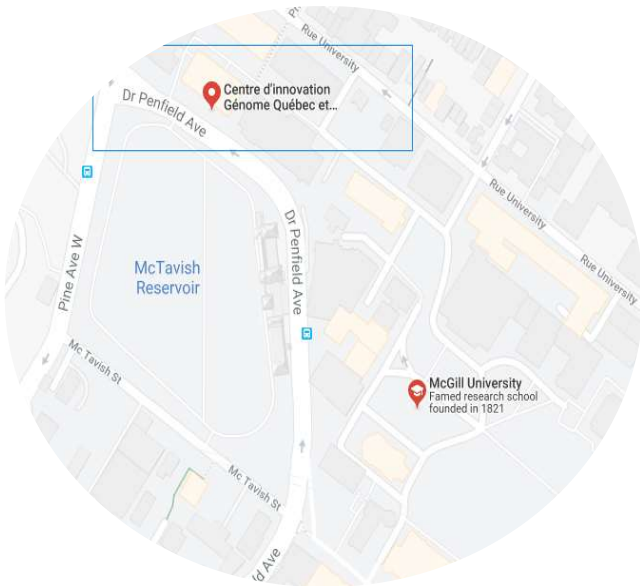
Intro to programming in R

Lead: Adrien Osakwe

February 14, 2024

Slides adapted from material by Larisa M. Soto

Mission statement: deliver quality workshops designed to help biomedical researchers develop the skills they need to succeed.



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| Workshop | Date | Location | Registration |
|--|-------------------|--|----------------------|
| How to think in Code | Feb. 2 9AM-11AM | McIntyre Room 325 | Open |
| Intro to UNIX and HPC | Feb. 7 9AM-1PM | McIntyre Room 325 | Open |
| Git and GitHub | Feb. 9 1PM-5PM | Arts Room 150 | Open |
| Intro to R (Part 1) | Feb. 14 9AM-1PM | Macdonald Engineering Building Room 10 | Open |
| Data Analysis in R (Part 2) | Feb. 19 1PM-5PM | 680 Sherbrooke Room 1279 | Open |
| Intro to Python (Part 1) | Feb. 20 9AM-1PM | McIntyre Room 325 | Open |
| Data Analysis in Python (Part 2) | Feb. 23 1PM-5PM | Arts Room 150 | Open |
| Meta-analysis of Genetic Association Results | Mar. 13 10AM-12PM | Education Room 113 | Open |
| WGS Data and Variant Calling | TBA | TBA | TBA |
| GWAS and PRS | TBA | TBA | TBA |
| Transcriptomics | TBA | TBA | TBA |

<https://www.mcgill.ca/micm/training/workshops-series>

Workshop outline Part 1

1 The language

History
Foundation
Syntax
Logical ops
Help
Packages

2 Data types

Vectors
Factors
Lists
Data Frames
Arrays
Hands on

3 Control Structures

Functions
If statement
for loop
Hands on

Workshop outline Part 2

4

Basic data manipulation

Read & Write
Subset
Split
Join

Hands on

5

Advanced data Manipulation

dplyr
tidyr
plyr
DataTable

Hands on

6

Generating Outputs

Graphics
ggplot2
RMarkdown
Templates

7

Software development

Good coding practices
Documentation standards
Debugging

Workshop Components

- Theory
- Code Examples
- Hands-on Activities

1. The R programming language

Learning objectives

- Why Excel is not enough
- What is R
- What is an IDE
- Basic Operations

Why not Excel?

- Easy at first glance
- **Issues**
 1. Hard to automate
 2. Hard to reproduce
 3. Inflexible
 4. Slow!





- **Statistical** Programming Language
- Integrated suite for **data manipulation, analysis, and graphical visualization**
- Environment where **statistical tests can be performed**
- Its functionality can be easily extended with ***packages***
- GNU project of free software
- Users have the freedom to:
 - Run the program
 - View and modify the source code
 - Redistribute copies and
 - Distribute their modifications

R facts

- Interpreted language
- Object-oriented
- No spaces allowed in variable names
- Case sensitive
- 1-based indexing
- Allows user-defined functions
- Works with environments

R Files

- Many types of files can contain R code
 - **.R 'Script'**
 - **.Rmd 'R Notebook'**
 - **.qmd 'Quarto Notebook'**
 - **.ipynb 'Jupyter Notebook'**
- Scripts
 - Automation & Portability
- Notebooks
 - Documentation
 - Accessibility

R & RStudio



- R & RStudio are **different entities**
- R is the programming language
 - The actual code we execute
 - Developed at the University of Auckland
- RStudio is an **Integrated Development Environment (IDE)**
 - A GUI software to develop and execute R code
 - Developed by Posit

```
PS C:\Program Files\R\R-4.2.2\bin> .\R.exe
```

```
R version 4.2.2 (2022-10-31 ucrt) -- "Innocent and Trusting"  
Copyright (C) 2022 The R Foundation for Statistical Computing  
Platform: x86_64-w64-mingw32/x64 (64-bit)
```

```
R is free software and comes with ABSOLUTELY NO WARRANTY.  
You are welcome to redistribute it under certain conditions.  
Type 'license()' or 'licence()' for distribution details.
```

```
  Natural language support but running in an English locale
```

```
R is a collaborative project with many contributors.  
Type 'contributors()' for more information and  
'citation()' on how to cite R or R packages in publications.
```

```
Type 'demo()' for some demos, 'help()' for on-line help, or  
'help.start()' for an HTML browser interface to help.  
Type 'q()' to quit R.
```

```
> print('hello world')  
[1] "hello world"  
> |
```

Source Pane

Environment Pane

The screenshot displays the RStudio interface with four panes highlighted by colored borders and arrows:

- Source Pane (Red border):** Shows the R script file `IntroR.Rmd`. The script includes a YAML header for a report, a code chunk with `knitr::include_graphics("images/MiCM_Logo.jpg")`, and a plot of the MiCM logo. Below the script, the rendered HTML output is visible, including the MiCM logo and the title "Introduction to R".
- Environment Pane (Pink border):** Displays the current environment with two variables: `var1` (value "mango") and `var2` (value "mangos").
- Console Pane (Yellow border):** Shows the R console output for the current session. It includes the execution of `letters[1]` and `letters[2]`, the execution of `knitr::include_graphics` for two images, and the execution of `var1 <- var2` which results in an error: `Error: object 'var1' not found`.
- Files/Plot/Help Pane (Purple border):** Displays the file explorer for the current project, showing a list of files and folders including `.Rhistory`, `data`, `Install_R_Rstudio.pdf`, `MICM_IntroToR.pdf`, `MICM_IntroToRProgramming.Rproj`, `MICM_outline_IntroR.docx`, `README.md`, `scripts`, and `MiCM_IntroToR.pptx`.

Console Pane

Files/Plot/Help Pane

Arithmetic operators

| | |
|-----------------------|----------|
| Addition | + |
| Subtraction | - |
| Division | / |
| Power | \wedge |
| Scalar multiplication | * |
| Matrix multiplication | %**% |

Syntax operators

| | |
|----------------|----|
| Comment line | # |
| Assignment | <- |
| Access content | \$ |
| Equal | = |

Logical operators

| | |
|--------------------------|-------|
| Equal | == |
| Not equal | != |
| Greater than | > |
| Greater than or equal to | >= |
| Less than | < |
| Less than or equal to | <= |
| contains | %in% |
| x AND y | x & y |
| x OR y | x y |
| NOT x | !x |

Data types and data structures

Learning objectives

- Understand the differences between classes, objects and data types in R
- Create objects of different types
- Subset and index objects
-
- Learn and use vectorized operations

Atomic Classes

Also called data types

| | |
|------------------------|---------------------------|
| Character | A,b,c,d,e,.. |
| Numeric (real numbers) | 1.00,2.00,... Inf, NaN |
| Integer | 1L,2L,3L,4L,.... |
| Complex | 2i |
| Logical (True/False) | TRUE,FALSE |
| Missing Value | NA |

Objects

Also called data structures

| | |
|------------|------------------------------------|
| Vector | Only elements of the same class |
| List | Elements of any class |
| Factor | Categorical data |
| Matrix | Elements of the same class in 2D |
| Data frame | Elements of multiple classes in 2D |
| NULL | Empty object |

One dimension

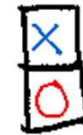
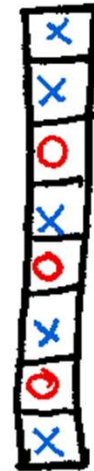
Vector



List



Factor

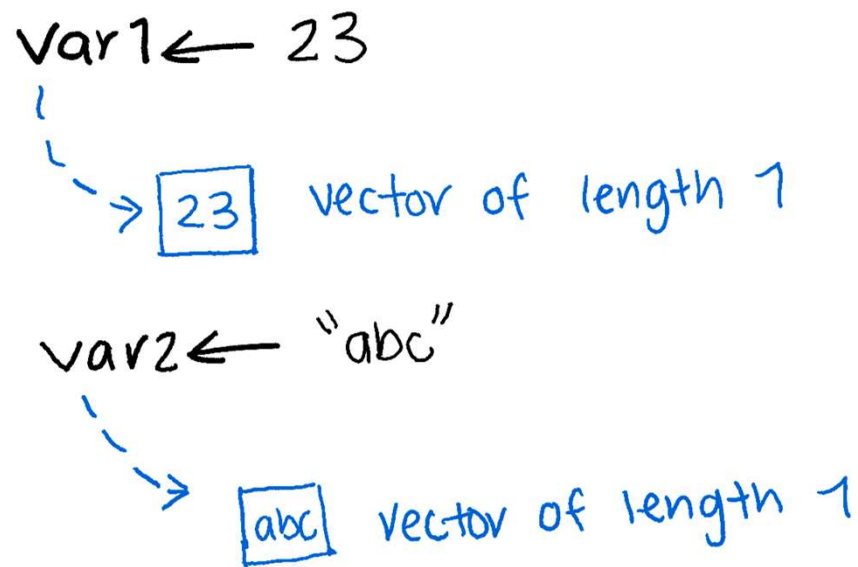


↑
levels

↑
elements

Vectors

- Can only contain objects of the **same class**
- Most basic type of R object
- Variables are vectors



Vectorized operations

Hand-drawn diagram illustrating vector addition. Two vertical vectors are added together to produce a third vector. The first vector has elements [1, 2, 1, 4, 5, 7, 8, 2]. The second vector has elements [2, 5, 3, 9, 7, 5, 6, 7]. The resulting vector has elements [3, 7, 4, 13, 12, 12, 14, 9]. A blue arrow labeled $1+2$ points to the first element of the result vector, 3.

Hand-drawn diagram illustrating matrix addition. Two 3x3 matrices are added together to produce a third 3x3 matrix. The first matrix has elements $\begin{bmatrix} 3 & 6 & 8 \\ 2 & 1 & 5 \\ 7 & 4 & 9 \end{bmatrix}$. The second matrix has elements $\begin{bmatrix} 5 & 1 & 7 \\ 3 & 4 & 6 \\ 8 & 9 & 2 \end{bmatrix}$. The resulting matrix has elements $\begin{bmatrix} 8 & 7 & 15 \\ 5 & 5 & 11 \\ 15 & 13 & 11 \end{bmatrix}$. Blue circles highlight the top-left elements (3 and 5) of the input matrices, and a blue arrow labeled $3+5$ points to the top-left element (8) of the result matrix.

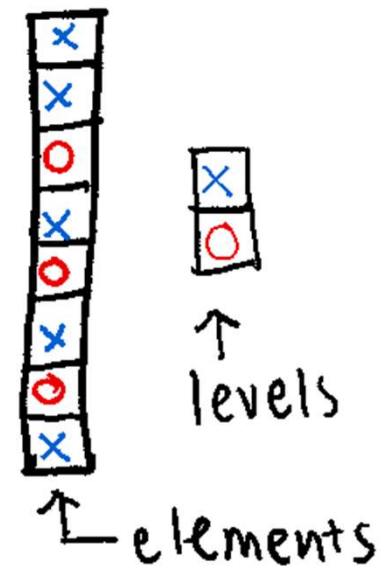
Lists

- Can contain objects of multiple classes
- Very important data type in R
- Extremely powerful when combined with some built-in functions



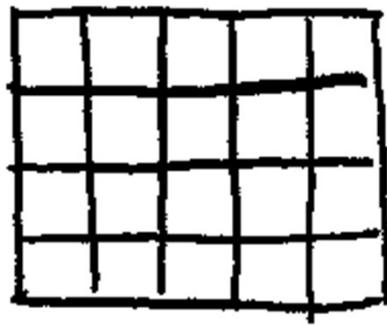
Factors

- Useful when for categorical data
- Can have implicit order, if needed
- Each **element** has a label or **level**
- They are important in statistical modelling and plotting with ggplot
- Some operations behave differently on factors



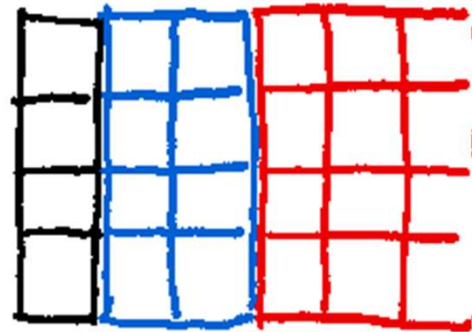
Multiple dimensions

Matrix



4x5

Data Frame



Break

Control structures and functions

Learning objectives:

- Understand the concept of environments in R
- Create new functions
- Implement conditional statements
- Implement a for loop to iterate over a list of files

Conditional statements

- When we want a set of actions to be executed only if certain conditions are met

```
# if
if (condition is true) {
  perform action
}

# if ... else
if (condition is true) {
  perform action
} else { # that is, if the condition is false,
  perform alternative action
}
```

For loop

- Repeat a set of operations a certain number of times

```
for (iterator in set of values) {  
    do a thing  
}
```

While loop

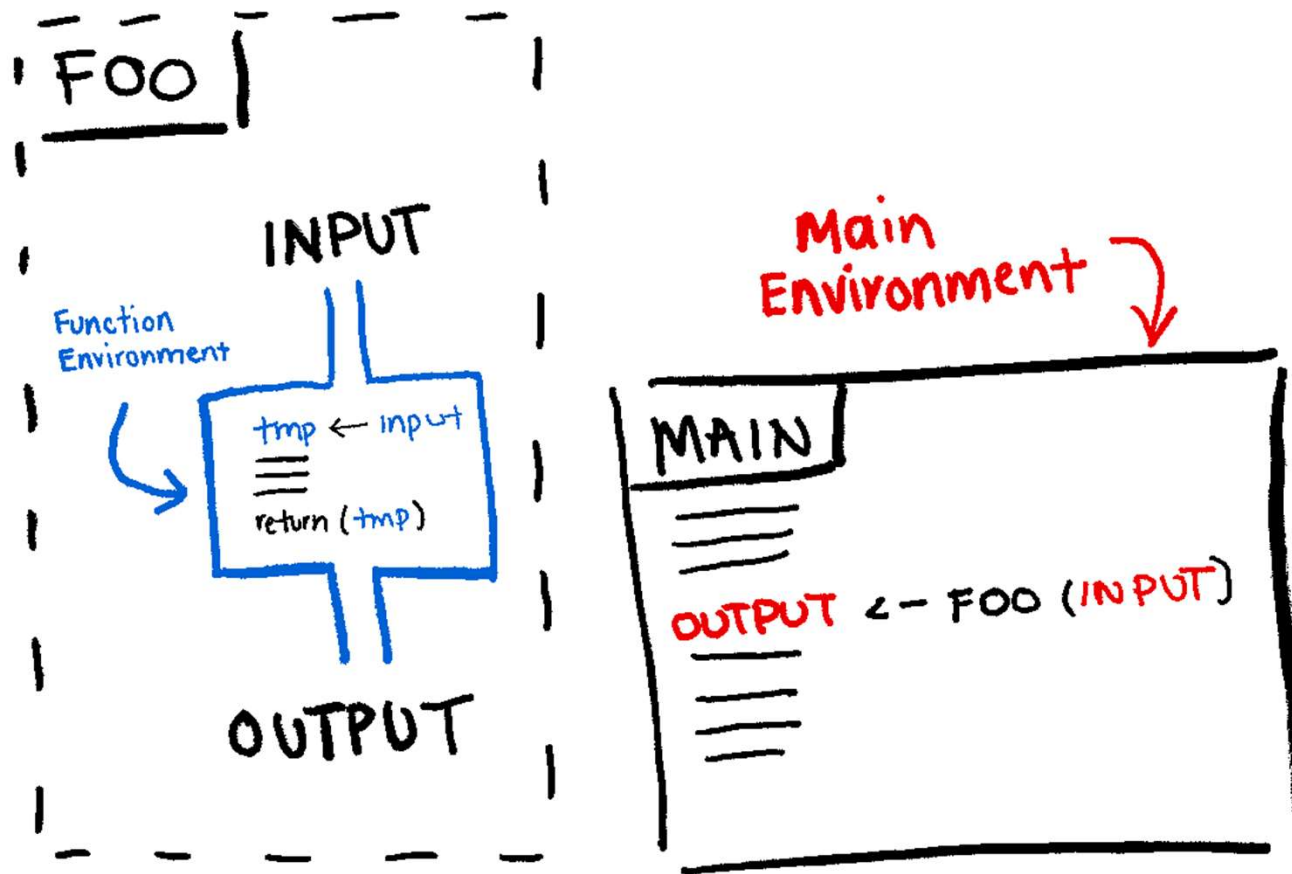
- Repeat a set of operations until a condition is no longer met

```
while(condition_is_true){  
    do a thing  
}
```


What if base R is not enough?

- Sometimes your analysis requires tools that are not available in base R
- Two options:
 1. **Create new functions**
 2. **Packages** provide a way to incorporate methods and functions from

Functions and environments

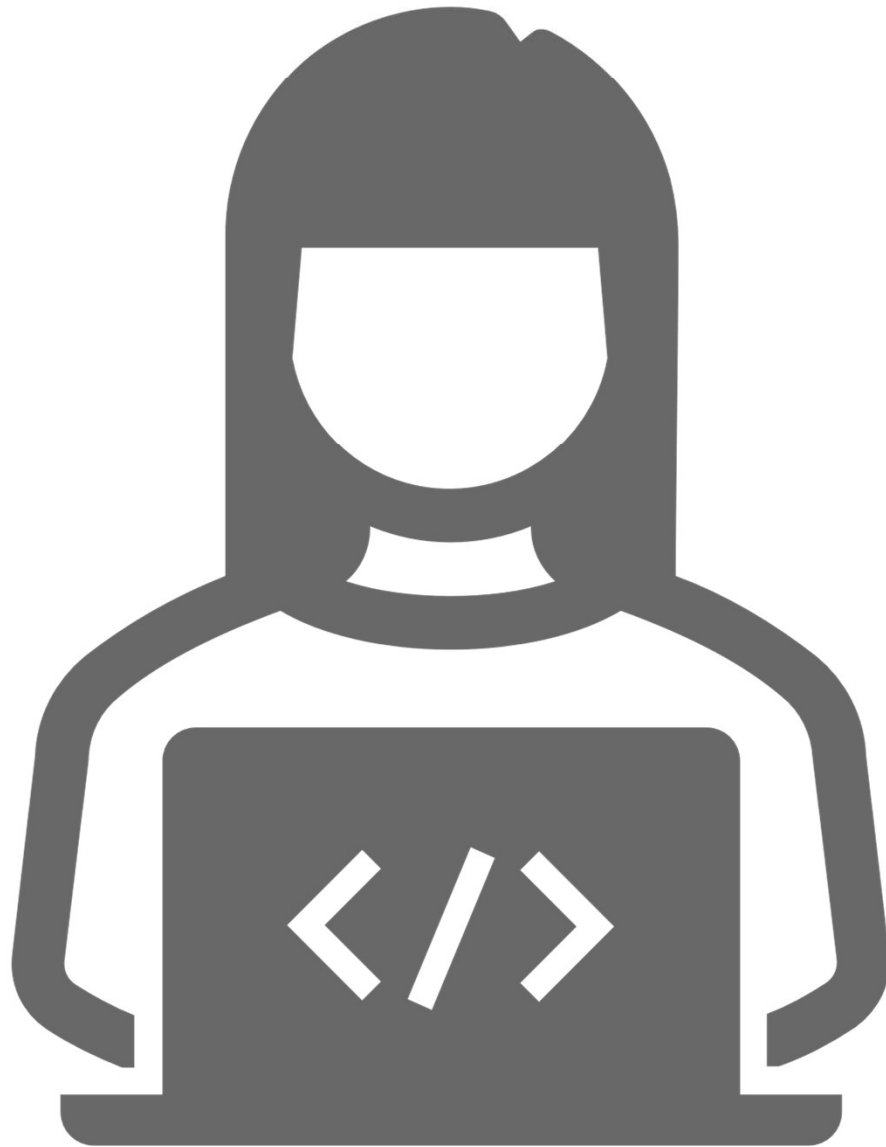


Pass by value and scope

- When we pass an object to a function, a copy of it is created internally
- The changes made inside the function won't modify the original object we passed to it
- Any variables created inside the function will only exist during the function's execution time

Packages

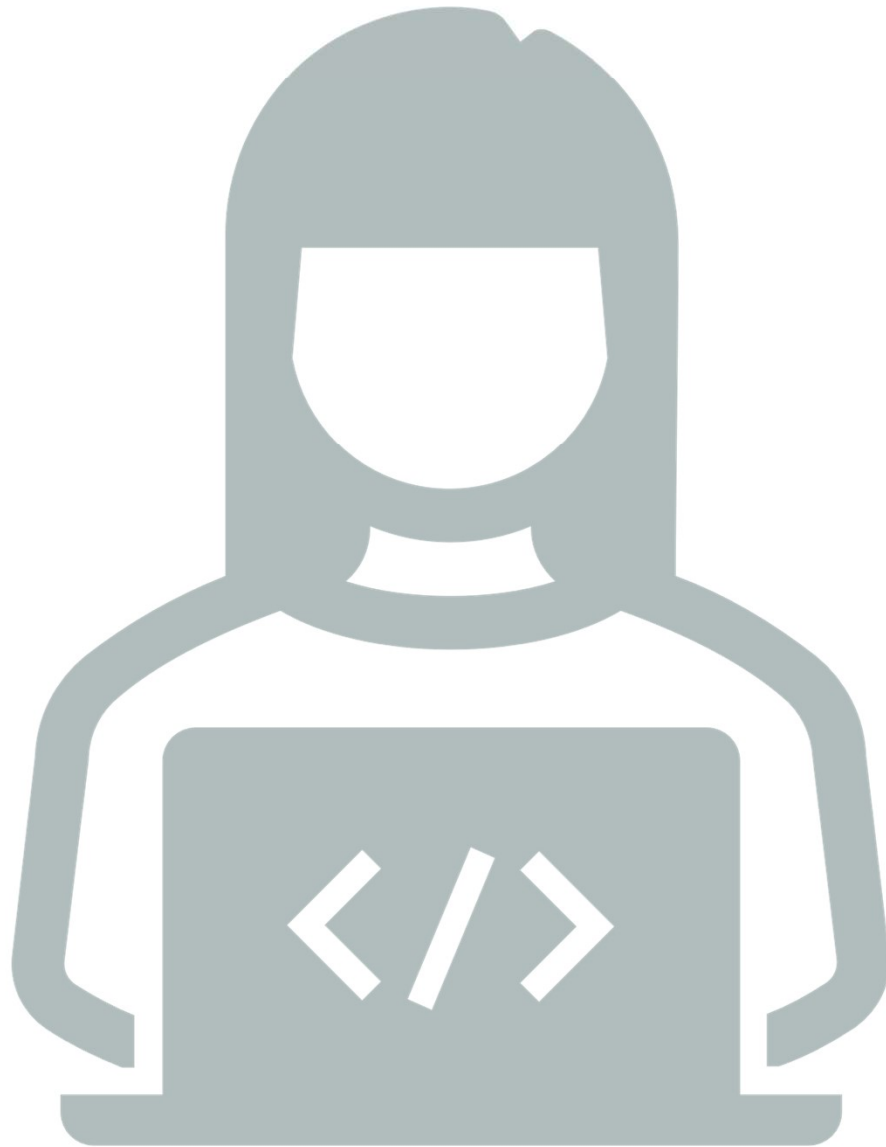
- Packages are a way for users to share methods they have developed
- Incorporate novel methods, datasets, or visualization tools
- Downloaded from many places:
 - **Comprehensive R Archive Network (CRAN)**
 - **Bioconductor**
 - GitHub, Bitbucket etc.



Basic data manipulation

Learning objectives:

- Learn how to read/write data to/from files with different formats (.tsv, .csv)
- Familiarize with basic operations of data frames
- Index and subset data frames using base R functions
- Manipulate specific data frame columns
- Joining by columns and rows



Advanced data manipulation

Learning objectives:

- Become familiar with the dplyr syntax
- Create pipes with the operator `%>%`
- Perform operations on data frames using dplyr and tidyr functions
- Implement functions from other external packages

Split-Apply-Combine problem

INPUT

| x | y |
|---|---|
| a | 2 |
| a | 4 |
| b | 0 |
| b | 5 |

SPLIT

| x | y |
|---|---|
| a | 2 |
| a | 4 |
| b | 0 |
| b | 5 |

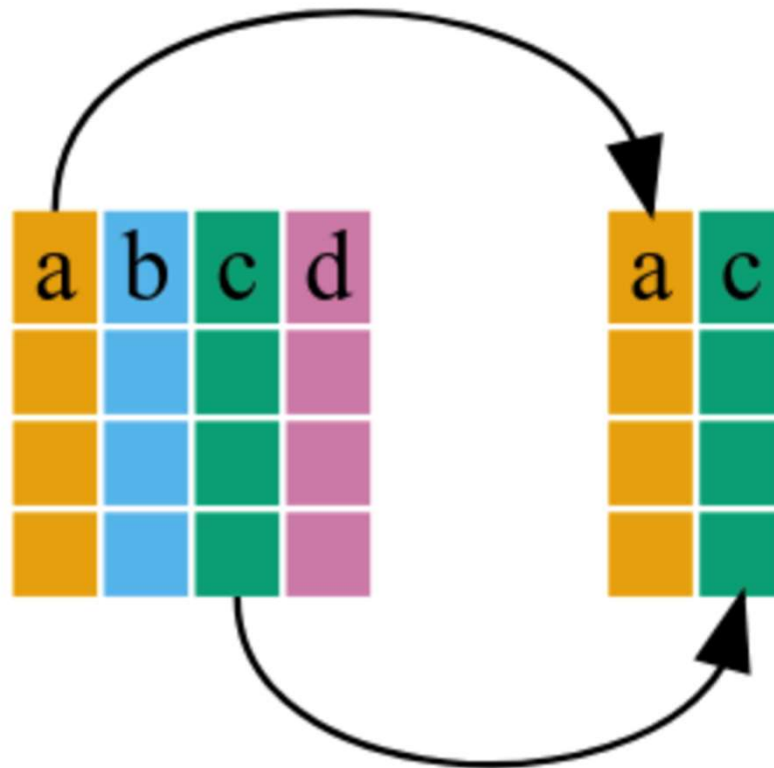
APPLY

| x | y |
|---|-----|
| a | 3 |
| b | 2.5 |

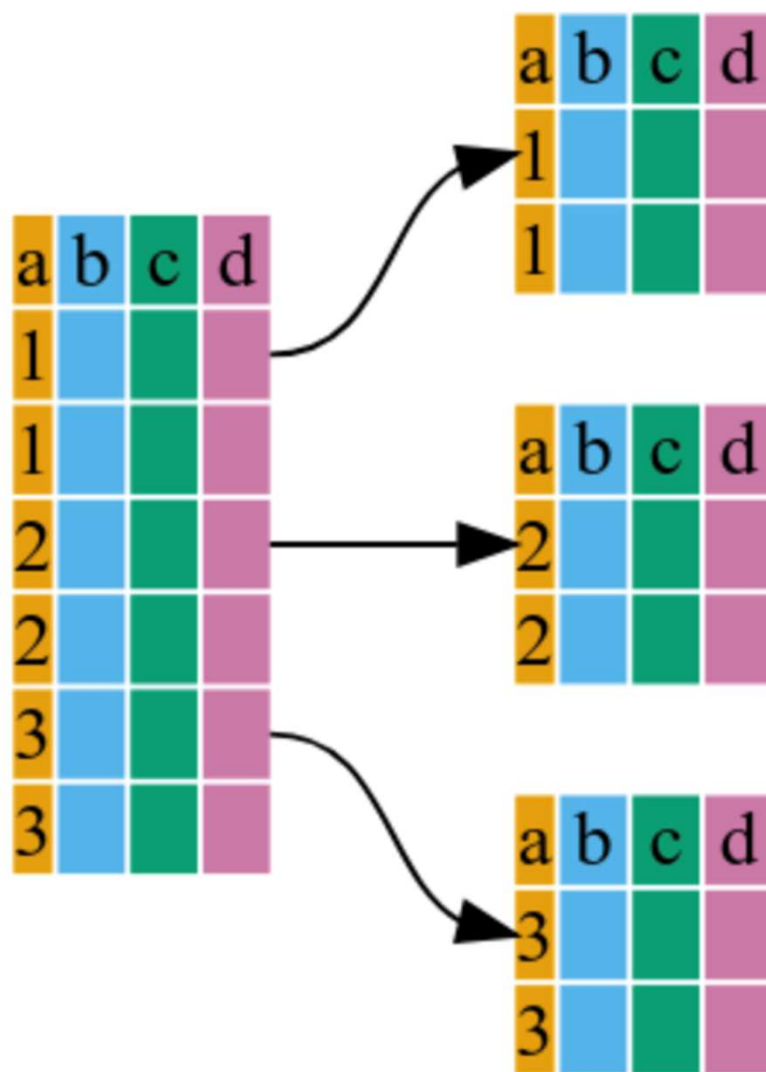
COMBINE

| x | y |
|---|-----|
| a | 3 |
| b | 2.5 |

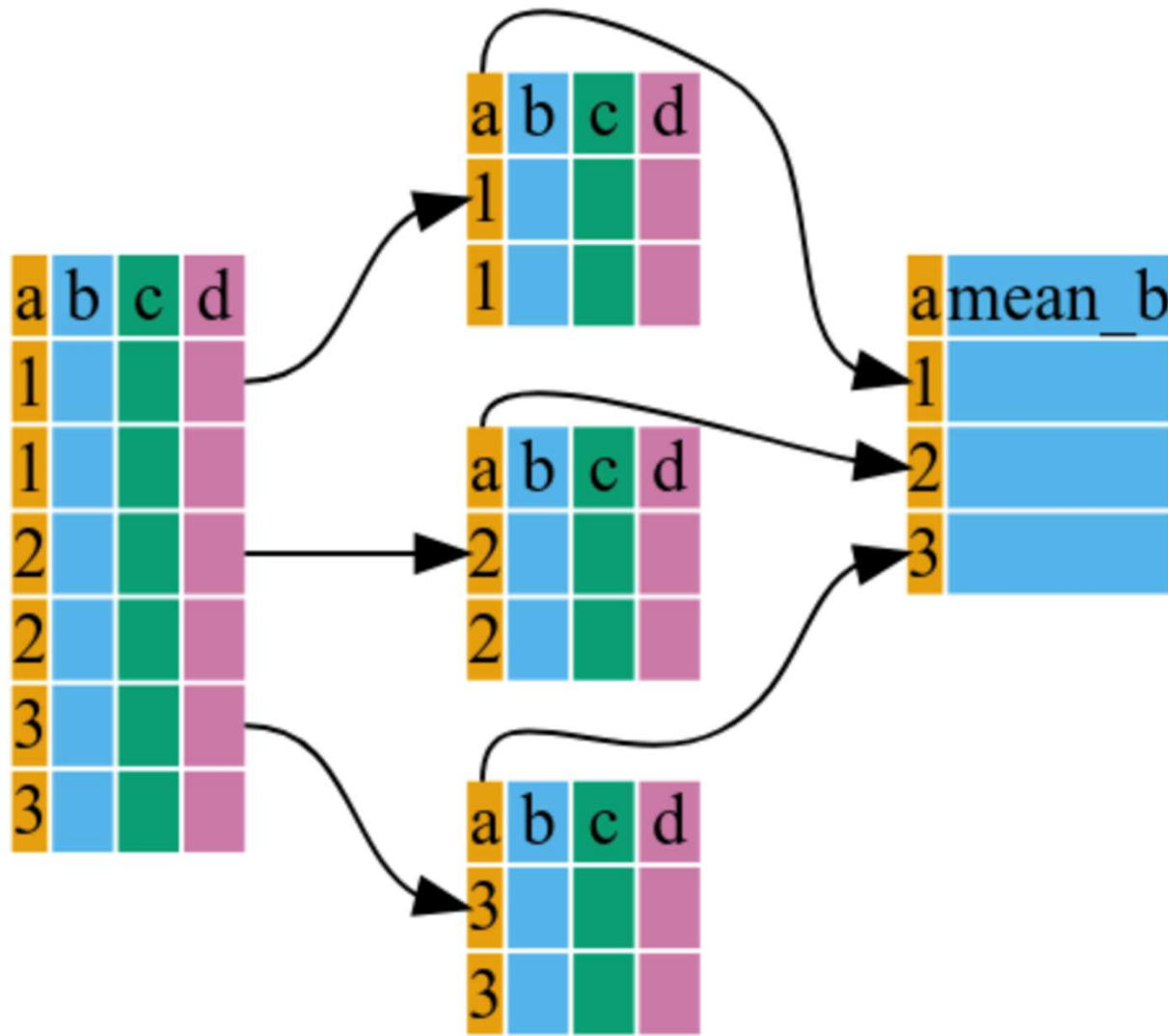
Select

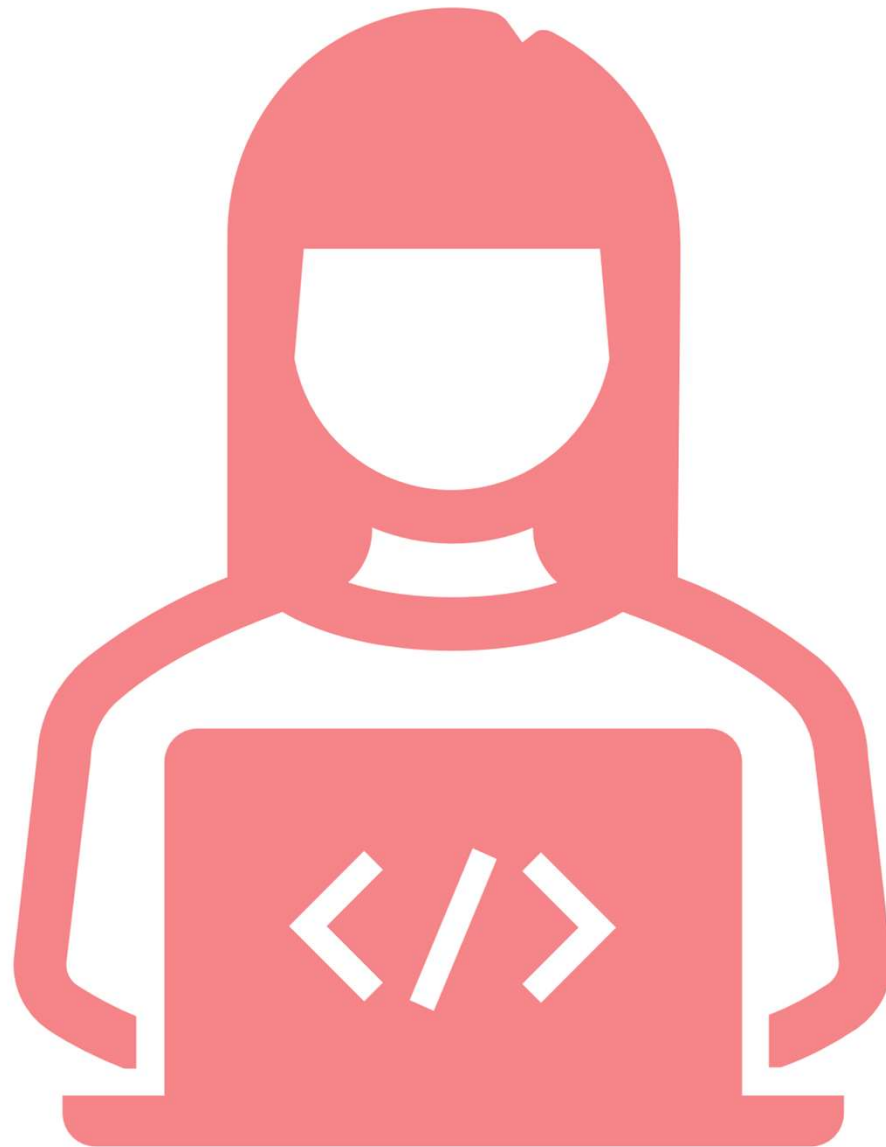


Group by



Summarize





Break

Generating visual outputs

Learning objectives:

- Create basic plots using base R functions
- Understand the connection between data frames and ggplot2
- Create basic graphs with ggplot2
- Use factors to customize graphics in ggplot2
- Learn about RMarkdown syntax to create reports
- Get familiar with existing RMarkdown templates

Formatting data for ggplot

WIDE

| | a | b | c |
|---|---|----|---|
| 1 | 5 | 10 | |
| 2 | 7 | 11 | |
| 1 | 4 | 9 | |

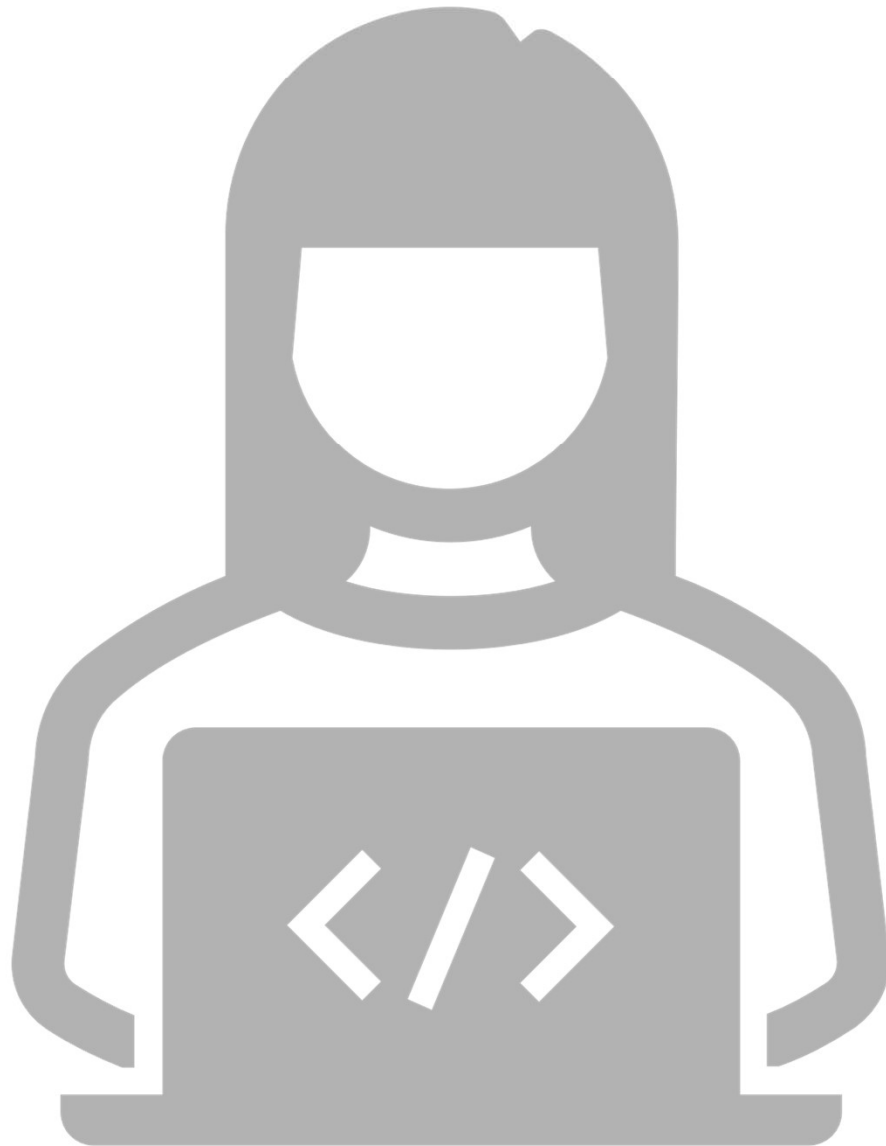
Values

Variables

LONG

| Values | variables |
|--------|-----------|
| 1 | a |
| 2 | q |
| 1 | a |
| 5 | b |
| 7 | b |
| 4 | b |
| 10 | c |
| 11 | c |
| 9 | c |

grouping factor



Activity: Analyzing a medical data set

Learning objectives:

- Familiarize with a real-life use case of R
- Apply the knowledge from previous modules to create an analysis pipeline

COVID testing dataset

Details

Data on testing for SARS-CoV2 from days 4-107 of the COVID pandemic in **2020**. CHOP is a pediatric hospital in Philadelphia, Pennsylvania, USA. These data have been anonymized, time- shifted, and permuted.

The dataset

Documentation

- Part of the medicaldata package
- https://htmlpreview.github.io/?https://github.com/higgi13425/medicaldata/blob/master/man/description_docs/covid_desc.html
- https://htmlpreview.github.io/?https://github.com/higgi13425/medicaldata/blob/master/man/codebooks/covid_testing_codebook.html

Format

A data frame with 15524 observations and 17 variables

subject_id id number for each subject; type: numeric

fake_first_name an auto-generated fake first name; type: character

fake_last_name an auto-generated fake last name; character

gender anonymized Gender, levels: female, male; type: character

pan_day day after start of pandemic; type: numeric

test_id test that was performed, levels: covid, xcvd1; type: character

clinic_name Clinic or ward where the specimen was collected, 88 levels; type: character

result result of test, levels: positive, negative, invalid; type: character

demo_group patient group, levels: patient, misc_adult, client, other adult, unidentified; type: character

age Age of subject at time of specimen collection (Anonymized), units = years; type: numeric

drive_thru_ind Whether the specimen was collected via a drive-thru site, levels: 1: Collected at drive-thru site; 0: Not collected at drive-thru site; type: numeric

ct_result Cycle at which threshold reached during PCR, range: 14.05-45; type: numeric

orderset Whether an order set was used for test order, levels: 1: Collected via orderset; 0: Not collected via orderset; numeric

payor_group Payor associated with order, levels: commercial, government, unassigned, medical assistance, self pay, charity care, other; type: character

patient_class Disposition of subject at time of collection, levels: inpatient, emergency, observation, recurring outpatient, outpatient, not applicable, day surgery, admit after surgery-obs, admit after surgery-ip; type: character

col_rec_tat Time elapsed between collect time and receive time, range: 0 - 61370.2, units = hours; type: numeric

rec_ver_tat Time elapsed between receive time and verification time, range: -18.6 - 218.2, units = hours; type: numeric ...

Software development concepts

Learning objectives:

- Familiarize with general good coding practices
- Learn about documentation standards
- Things to avoid when programming in R
- Learn how to debug and troubleshoot

What we learned today:

- What is R
- Basic syntax, data types
- Data Manipulation and Visualization
- Package Installation

What's next?

Data Analysis in R Workshop (Part 2)

- Data Wrangling
- Linear Regression & Statistical Analysis
- Classification

| | | | |
|-----------------------------|-----------------|--------------------------|----------------------|
| Data Analysis in R (Part 2) | Feb. 19 1PM-5PM | 680 Sherbrooke Room 1279 | Open |
|-----------------------------|-----------------|--------------------------|----------------------|

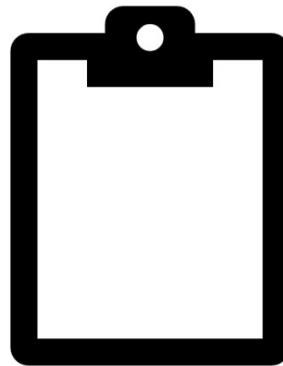
Thank you for attending!

1



Scan the QR code to confirm you attended today's workshop.

2



Fill out the feedback survey in the next 72h.

3



Get recognition for this workshop on your co-curricular record.

Useful links

- [R software project](#)
- [RStudio Cheatsheet](#)
- [R ggplot2 Cheatsheet](#)
- [R dplyr Cheatsheet](#)
- [More resources](#)