

# Brief Intro to R for Flow Packages Users

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Introduction

Atomic Vectors

Matrix

data.frame

Lists

Functions

The flowFrame and flowSet Classes

# Outline

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data.frame

Lists

Functions

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# Packages

## Repository

R distributes software via *packages*.

- ▶ CRAN – primarily for statistics research and data analysis.
- ▶ Bioconductor – focus on analysis of high-throughput biological data.

## Starting R

Finding packages; installing packages; and attaching packages.

```
> ## attaching packages  
> library(flowCore)
```

# Installing Packages

Install Bioconductor packages (and their dependencies)

```
> source("http://bioconductor.org/biocLite.R")
> biocLite("flowCore")
```

Install from the flowTrack package

```
> pkg <- "myDir/flowTrack_1.0.0.tar.gz"
> install.packages(pkg, repos=NULL, type="source")
```

# Getting Help in R

- ▶ `help.start` and HTML help button in the Windows GUI
- ▶ `help` and `?:` `help('data.frame')`
- ▶ `help.search`, `apropos`
- ▶ `browseVignettes`
- ▶ `RSiteSearch`
- ▶ R Mailing lists

# Outline

Introduction

Atomic Vectors

Matrix

data.frame

Lists

Functions

The flowFrame and flowSet Classes

## Atomic Vectors

Vector: one-dimensional array of items of the same type.

```
> # numeric  
> L <- c(1.2, 4.3, 2.3, 4)  
> W <- c(13.8, 22.4, 18, 18.9)  
> # most of functions are vectorized  
> length(L)
```

```
[1] 4
```

```
> area <- L * W  
> area  
[1] 16.56 96.32 41.40 75.60
```

Other basic data types:

```
> s <- "a string" # character  
> t <- TRUE # logical  
> i <- 1L # integer  
> i <- 1+1i # complex
```

# Functions for Creating Vectors

## Functions

- ▶ `c` - concatenate
- ▶ `:` - integer sequences
- ▶ `rep` - repetitive patterns

```
> 1:10  
[1] 1 2 3 4 5 6 7 8 9 10  
  
> rep(1:2, 3)  
[1] 1 2 1 2 1 2
```

## Exercise

1. Read the help page for `seq`
2. Use `seq` to generate a sequence of even integers between one to ten.

# Subsetting Vectors

## Naming

```
> ## name the elements of a vector  
> v <- c(a=1.1, b=2, c=100, d=50, e=60)  
> v
```

| a   | b   | c     | d    | e    |
|-----|-----|-------|------|------|
| 1.1 | 2.0 | 100.0 | 50.0 | 60.0 |

## Subsetting with positive indices

```
> v[c(1,3,4)]
```

| a   | c     | d    |
|-----|-------|------|
| 1.1 | 100.0 | 50.0 |

## Subsetting with negative indices

```
> v[-c(1:3)] # exclude elements
```

| d | e |
|---|---|
|---|---|

# Outline

Introduction

Atomic Vectors

Matrix

data.frame

Lists

Functions

The flowFrame and flowSet Classes

# Matrix

matrix - two-dimensional vector, all elements share a common type.

```
> x <- matrix(1:25, ncol=5, dimnames=list(letters[1:5],  
+                                         LETTERS[1:5]))  
> x
```

|   | A | B  | C  | D  | E  |
|---|---|----|----|----|----|
| a | 1 | 6  | 11 | 16 | 21 |
| b | 2 | 7  | 12 | 17 | 22 |
| c | 3 | 8  | 13 | 18 | 23 |
| d | 4 | 9  | 14 | 19 | 24 |
| e | 5 | 10 | 15 | 20 | 25 |

```
> x[, 2]  
  
a b c d e  
6 7 8 9 10
```

# Matrix

## Exercise

1. Remove the second row and the fourth column from `x`
2. Subset `x` to keep the 'D' column.

# Outline

Introduction

Atomic Vectors

Matrix

`data.frame`

Lists

Functions

The `flowFrame` and `flowSet` Classes

## data.frame

- ▶ A special R structure.
- ▶ Analogous to a table where each row represents a sample and each column an attribute of a sample.

## data.frame

```
> df <- data.frame(type=c("case", "case",
+                      "control", "control"), time=rexp(4))
> df

      type      time
1   case 0.77739394
2   case 1.95270944
3 control 0.91402175
4 control 0.02171282

> df$time
[1] 0.77739394 1.95270944 0.91402175
[4] 0.02171282

> names(df)
[1] "type" "time"
```

# Outline

Introduction

Atomic Vectors

Matrix

data.frame

Lists

Functions

The flowFrame and flowSet Classes

## Lists

Recursive data structure – a list can contain other lists and other types of data structures.

```
> lst <- list(a=1:4, b=c("X", "Y"),
+               uspaper=list(length=11, width=8.5))
> lst
$a
[1] 1 2 3 4

$b
[1] "X" "Y"

$uspaper
$uspaper$length
[1] 11

$uspaper$width
[1] 8.5
```

# Subsetting Lists

- ▶ [[ – extracting a single element from a list

```
> lst[[1]]
```

```
[1] 1 2 3 4
```

- ▶ [ – extracting a sub-list of the list

```
> lst[1]
```

```
$a
```

```
[1] 1 2 3 4
```

- ▶ \$ – accessing list elements by name.

```
> lst[["b"]]
```

```
[1] "X" "Y"
```

# Outline

Introduction

Atomic Vectors

Matrix

data.frame

Lists

Functions

The flowFrame and flowSet Classes

# Functions

```
> say <- function(name, greeting="hello")
+ {
+   paste(greeting, name)
+ }
> say("world")
[1] "hello world"
```

# Outline

Introduction

Atomic Vectors

Matrix

`data.frame`

Lists

Functions

The `flowFrame` and `flowSet` Classes

# The flowFrame and flowSet Classes

- ▶ `flowFrame` - a class representing the data contained in a FCS file.
  1. raw measurement
  2. keywords in the FCS files
  3. annotation for parameters (stains, sample names, range)
- ▶ `flowSet` - a collection of `flowFrame`.

## The flowFrame and flowSet Classes

```
> library(flowCore)
> data(GvHD)
> class(GvHD)
[1] "flowSet"
attr(package)
[1] "flowCore"
> GvHD
```

A flowSet with 35 experiments.

An object of class "AnnotatedDataFrame"

rowNames: s5a01, s5a02, ..., s10a07 (35 total)

varLabels and varMetadata description:

Patient: Patient code

Visit: Visit number

...: ...

name: NA

(5 total)

## flowFrame

### Subsetting

```
> f[, "FSC-H"]

flowFrame object 's5a01'
with 3420 cells and 1 observables:
      name      desc range minRange
$P1 FSC-H FSC-Height  1024      0
      maxRange
$P1      1023
119 keywords are stored in the 'description' slot
```

### Extracting raw data

```
> head(exprs(f))
```

## Some Methods for `flowFrame`

- ▶ `exprs`
- ▶ `colnames, featureNames` - names
- ▶ `keyword, identifier` - FCS keywords
  - > `keyword(f, "FILENAME")`

`$FILENAME`

```
[1] "s5a01"
```
- ▶ `parameters` - parameter annotation
- ▶ `range` - dynamic range
- ▶ `plot, xyplot` - visualization (`flowViz`)
- ▶ `spillover` - spillover matrix
- ▶ `transform, filter, Subset` and etc. - actions

## Some Methods for `flowFrame`

### `xyplot`

```
> library(flowViz)
> xyplot(`FSC-H` ~ `SSC-H`, f)
```

- ▶ accessing `flowViz::xyplot`.
- ▶ formula: ``FSC-H` ~ `SSC-H``. Variables FSC-H (Y axis of the plot) and SSC-H (X axis of the plot) are the primary variables; separated by `~`.
- ▶ data: a `flowFrame`.

# Some Methods for flowSet

## Working with flowSet

- ▶ [, [], \$ - subsetting
- ▶ sampleNames, colnames - names
- ▶ phenoData, pData - metadata
- ▶ fsApply - apply family, flowSet-specific iterator

## Actions items

compensation, transformation, normalization, filtering and gating

## Some Methods for flowSet

### Examples

```
> head(pData(phenoData(GvHD)))
```

|       | Patient | Visit | Days | Grade | name  |
|-------|---------|-------|------|-------|-------|
| s5a01 | 5       | 1     | -6   | 3     | s5a01 |
| s5a02 | 5       | 2     | 0    | 3     | s5a02 |
| s5a03 | 5       | 3     | 6    | 3     | s5a03 |
| s5a04 | 5       | 4     | 12   | 3     | s5a04 |
| s5a05 | 5       | 5     | 19   | 3     | s5a05 |
| s5a06 | 5       | 6     | 26   | 3     | s5a06 |

```
> ## loop over a flowset to get the range for the  
> ## first three flowFrames  
> fsApply(GvHD[1:3], range)
```

## Selected Reference

- ▶ *Software for Data Analysis: Programming with R* by John Chambers.
- ▶ *R Programming for Bioinformatics* by Robert Gentleman.
- ▶ *Multivariate Data Visualization with R* by Deepayan Sarker.