

Single Day Event

How not to 'err' with R?

Nandini Rajendhiran
and Anmol Gureja,
Novartis



Content

- Introduction
- Risks
- Challenges and solutions
- Packages and functions
- Future scope



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Introduction

From the perspective of **Statistical Programming**, use of open-source software such as R is the next evolutionary step in Clinical trials. Implementation of **R programming** for the **validation** of all **CSR related Tables, Listings, and Figures** of a **Full Development Study** has shown how to venture into this.

Why?

Evolving with current trends in the industry, TFLs validation is a good starting point to explore open-source software

Who?

Identified a few SAS programmers who are academically/ externally trained in R

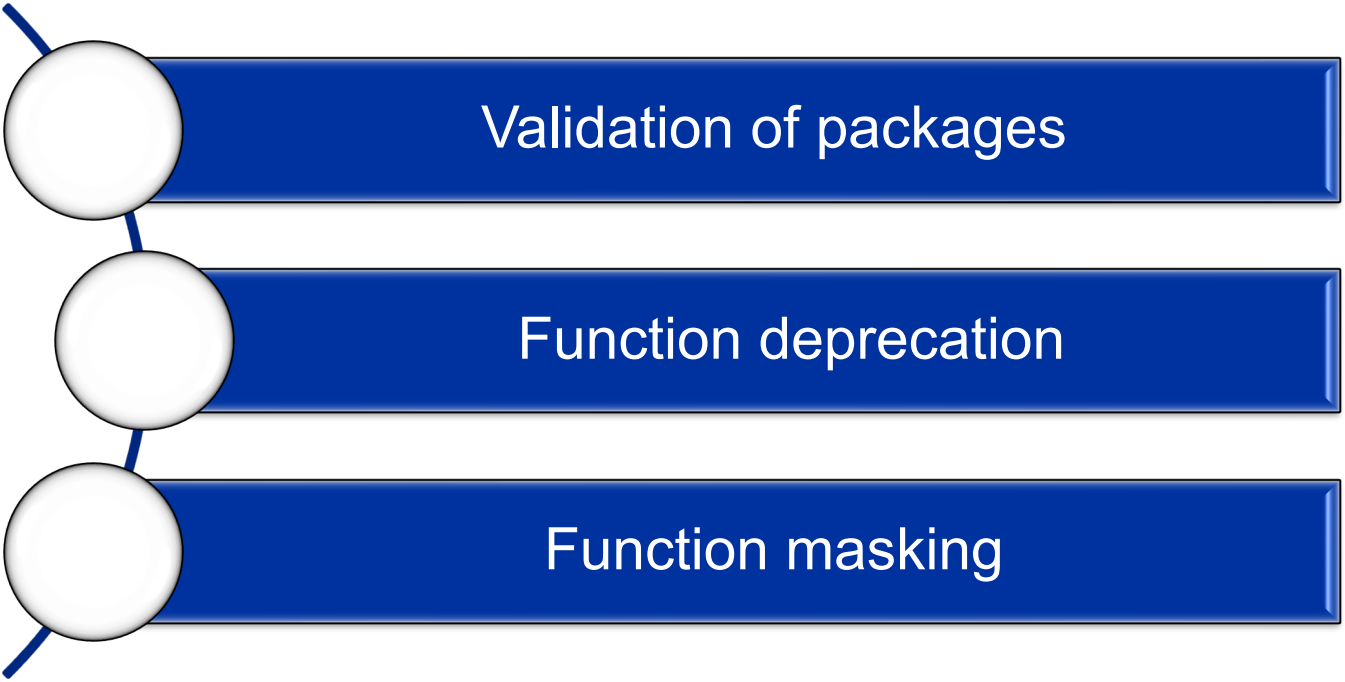
How?

Using R Programming, exploring new packages, with focus on meeting industry-level standards



Risks

During the process of validation, few risks were identified that we could minimize at initial stage.

A diagram consisting of three horizontal blue bars with rounded ends, stacked vertically. To the left of each bar is a white circle with a blue outline. A blue line connects the top-left of the first circle, the middle-left of the second circle, and the bottom-left of the third circle. Each bar contains white text.

Validation of packages

Function deprecation

Function masking



Validation of Packages

With the great capabilities and cost-effectiveness of R software, there is a concern of risk and compliance of it being open-source.



I should validate the package.



Will I get accurate results?

What if the package is updated?

Can I use any package?



Steps to follow

Investigating

Testing

Validating

Approval



Function related issues

- **Function deprecation:** As functions change in different versions of their packages, warnings may occur.

```
warning message:  
funs() is soft deprecated as of dplyr 0.8.0  
Please use a list of either functions or lambdas:  
  
# Simple named list:  
list(mean = mean, median = median)  
  
# Auto named with `tibble::lst()`:  
tibble::lst(mean, median)  
  
# Using lambdas  
list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))  
This warning is displayed once per session.
```

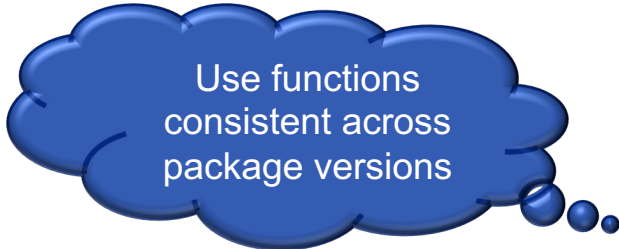
- **Function masking:** Different functions with the same name being present in different packages, the actual function being used may not be the one desired.

```
R 3.6.1> library(data.table)  
R 3.6.1> library(reshape2)
```

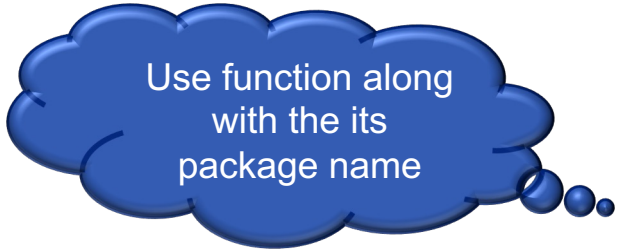
Attaching package: 'reshape2'

The following objects are masked from 'package:data.table':

dcast, melt



Use functions
consistent across
package versions

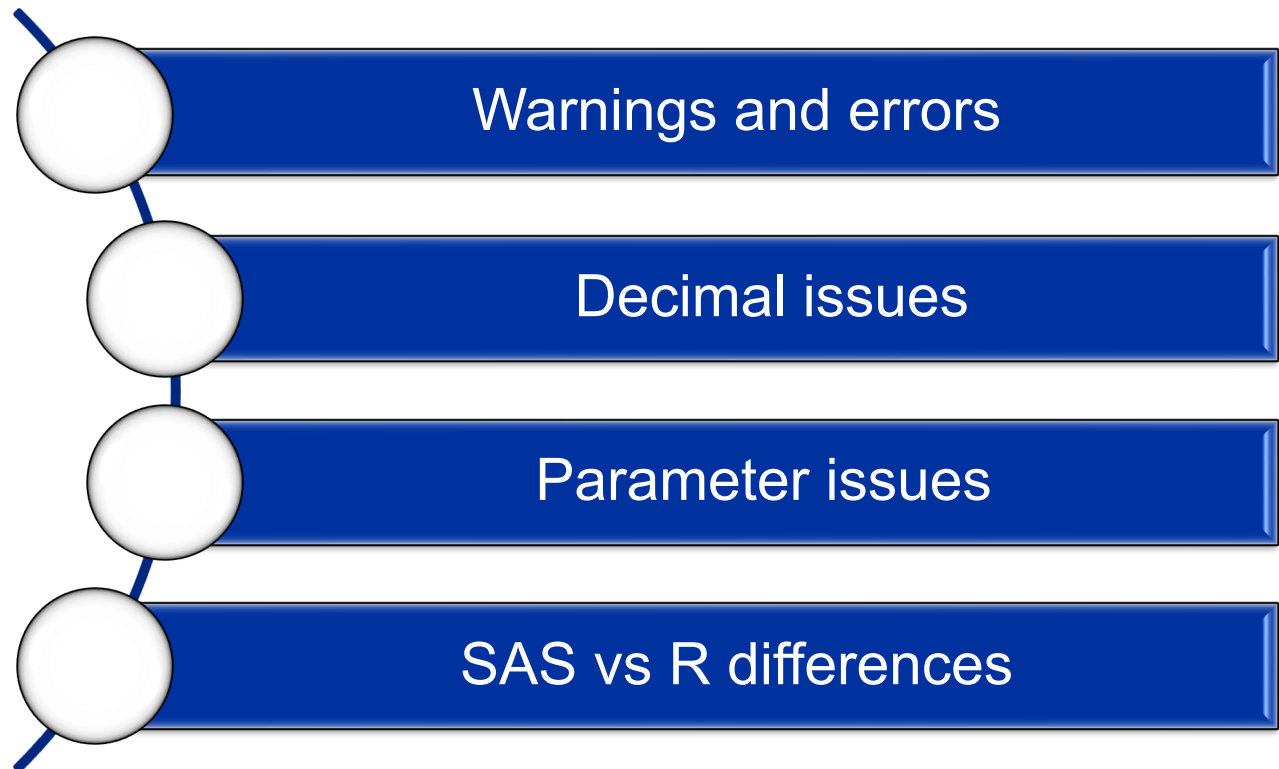


Use function along
with the its
package name



Ex.: data.table::dcast

Challenges faced

A vertical list of four challenges, each represented by a white circle on the left connected by a blue line to a blue rectangular box on the right. The challenges are: Warnings and errors, Decimal issues, Parameter issues, and SAS vs R differences.

Warnings and errors

Decimal issues

Parameter issues

SAS vs R differences





Warnings and errors

- Warning message:
attributes are not identical across measure variables;
they will be dropped
- Warning message:
In if (a > 0) { :
the condition has length > 1 and only the first element
will be used
- Error in .checkTypos(e, names_x) :
Object 'usubjid' not found. Perhaps you intended USUBJID

Remove redundant
attributes (or) use
alternate functions

Use appropriate
functions depending
on the data structure

Ensure variable in
right case is present



Decimal issues

- Confidence Interval calculations:** Mismatches due to formula issue

SAS values	R values
(-415.6, -223.8)	(-415.7, -223.8)
(-597.3, -128.2)	(-597.3, -128.1)
(-510.3, 31.5)	(-510.4, 31.5)
(-89.3, 72.0)	(-89.3, 71.9)

- Rounding off values:** Mismatches due to internal calculation rule

orig	round
2.55	2.6
2.65	2.7
2.75	2.8

Rounding in SAS

orig	round
2.55	2.5
2.65	2.6
2.75	2.8

Rounding in R

Parameter issues

The default parameter used in R gives different values compared to SAS.

1. **Quantile function**- Default parameter in R is **type=7**, but its equivalent in SAS is **type=2**

```
q1 = quantile(x = var, probs = 0.25, type=2, na.rm = T)
```

Check for appropriate formula being used in parameter type



variable	TrtA	TrtB	Total
25-75th percentiles	85.5 - 113.9	92.9 - 113.3	89.1 - 113.7

Values of quantiles in SAS

Type=7 (Default)

variable	TrtA	TrtB	Total
q1_q3	86.2-113.8	92.9-113.3	89.1-113.7

Values of quantiles in R

Type=2 (SAS equivalent)

variable	TrtA	TrtB	Total
q1_q3	85.5-113.9	92.9-113.3	89.1-113.7

Parameter issues

2. **Survfit function for CI** - Default parameter in SAS is **log-log**, but its default in R is **log**.

So this parameter has to be changed from log to log-log in R.

Check for appropriate formula being used in parameter type

```
CI = survfit(Surv(time,event)~grp, data, conf.type="log-log", conf.int=0.95)
```

Type= log (Default)

est	lower_CI	upper_CI
20.3	0	42.6
20.3	0	42.6

Type=log-log (SAS equivalent)

est	lower_CI	upper_CI
20.3	5.7	60.9
20.3	5.7	60.9

Values of CI in R

est	lower_CI	upper_CI
20.3	5.7	60.9
20.3	5.7	60.9

Values of CI in SAS





SAS vs R differences

Difference	SAS	R	How to handle it
Data type	2 types- Numeric and character	Multiple types- Integer, Complex, Character, Logical, etc.	Make sure type conversion is done where required
Data structure	Data tables	Vector, Matrix, data frame, list , etc.	Optimize use of data structures as required
Missing values	. and ""	NA, NA_numeric, NA_character, etc.	Ensure proper conversion of NA values

Packages and functions

Along with the base and stats packages, we relied on a few others such as:

- **pacman** – efficient loading and unloading of packages.
- **haven** – importing SAS datasets.
- **dplyr**, **tidyr** and **data.table** – more efficient handling of datasets.
- **sqldf** – functions to use SQL syntax in R.
- **stringr** and **lubridate**– functions for data types handling.
- **striprtf** and **arsenal** – import rtf files and compare datasets.





Future scope



- Use of R for development of datasets and TFLs.
- Create pharma related packages.
- Automate the process of developing TFLs using Shiny app.
- Utilization of validated and updated packages across organizations.



*“It always seems impossible until it’s done ” –
Nelson*

Mandela

Thank You



**The Global Healthcare
Data Science Community**

Contact Channels

📞 UK +44 1843 609600
📞 USA +1 609 514 5105
✉️ office@phuse.global
🌐 phuse.global

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