




# report: Automated Reporting of Results and Statistical Models in R

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## Summary

The `{report}` package is a powerful tool for researchers who use R to analyze data and create reports for publication. It bridges the gap between R's output and the formatted results to be included in a manuscript, allowing users to easily convert statistical models and data frames into textual reports that are suitable for publication. This paper provides an overview of this package, including its features, advantages, and ways to use it. We also provide examples of how the package can be used to standardize and improve results reporting in R.

## Statement of Need

Reporting results is a crucial part of scientific research. Researchers need to ensure that their results are reported accurately and clearly, so that other researchers can understand and reproduce their work. However, the process of results reporting can be time-consuming and error-prone, particularly when it comes to formatting data for publication ([[ref-nuijten2016prevalence](#)]). The `{report}` package was developed to address this problem, providing researchers with a tool that can help standardize and improve reporting results from their workflows in R. `{report}` is part of the *easystats* ecosystem of packages that build an R framework for easy statistical modeling, visualization, and reporting ([[ref-easystatspackage](#)]).

## Features

The package includes several features that make it a valuable tool for researchers. It can convert statistical models and data frames into textual reports, which can be easily customized and formatted to meet the requirements of a particular journal or publication. It can also automatically report demographics information from column names. The package supports a wide range of output formats, including HTML, LaTeX, and Microsoft Word, via RMarkdown.

Using this package in an analytic workflow has several advantages. First, it can help standardize results reporting across a research team or project, ensuring that everyone is using the same format and style. Second, the package can save researchers time by automating many of the tasks involved in reporting results, such as formatting tables and text. Third, the package can improve the quality of results reporting by providing users

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with a tool that is specifically designed for this purpose. Additionally, it prevents any copy-and-paste errors.

The examples below illustrate the ease with which `{report}` can create detailed textual or tabular summaries for statistical objects.

## Demographics

Note that when using `rmarkdown`, setting a chunk option to `results = "asis"` will print the output as regular text, as below, for a rather seamless reading experience.

```
library(report)

data <- data.frame(
  "Age" = c(22, 23, 54, 21, 8, 42, 18, 32, 24, 27, 45),
  "Sex" = c("Intersex", "F", "F", "M", "M", "M", "F", "F", "F", "F", "F"),
  "Gender" = c("N", "W", "W", "M", "M", "M", "W", "W", "W", "W", "W"),
  "Race" = c(
    "Black", NA, "White", "Asian", "Black", "Arab", "Black",
    "White", "Asian", "Southeast Asian", "Mixed"
  ),
  "Education" = c(
    "Bachelor", "PhD", "Highschool", "Master", "Bachelor",
    "Highschool", "Highschool", "Bachelor", "Bachelor",
    "Highschool", "Master"
  ),
  "Country" = c(
    "USA", NA, "Canada", "Canada", "India", "Germany", "USA",
    "USA", "USA", "USA", "Canada"
  )
)

cat(paste0(
  "This study includes data from ",
  report_participants(data), "."
))
```

This study includes data from 11 participants (Mean age = 28.7, SD = 13.4, range: [8, 54]; Sex: 63.6% females, 27.3% males, 9.1% other; Gender: 63.6% women, 27.3% men, 9.09% non-binary; Education: Bachelor, 36.36%; Highschool, 36.36%; Master, 18.18%; PhD, 9.09%; Country: 45.45% USA, 27.27% Canada, 27.27% other; Race: 27.27% Black, 18.18% Asian, 18.18% White, 36.36% other).

## Models

```
m_lm <- lm(mpg ~ qsec + wt, data = mtcars)
report(m_lm)
```

We fitted a linear model (estimated using OLS) to predict mpg with qsec and wt (formula: `mpg ~ qsec + wt`). The model explains a statistically significant and substantial proportion of variance ( $R^2 = 0.83$ ,  $F(2, 29) = 69.03$ ,  $p < .001$ , adj.  $R^2 = 0.81$ ). The model's intercept, corresponding to `qsec = 0` and `wt = 0`, is at 19.75 (95% CI [9.00, 30.49],  $t(29) = 3.76$ ,  $p < .001$ ). Within this model:

- The effect of `qsec` is statistically significant and positive ( $\beta = 0.93$ , 95% CI [0.39, 1.47],  $t(29) = 3.51$ ,  $p = 0.001$ ; Std.  $\beta = 0.28$ , 95% CI [0.11, 0.44])
- The effect of `wt` is statistically significant and negative ( $\beta = -5.05$ , 95% CI [-6.04, -4.06],  $t(29) = -10.43$ ,  $p < .001$ ; Std.  $\beta = -0.82$ , 95% CI [-0.98, -0.66])

Standardized parameters were obtained by fitting the model on a standardized version of the dataset. 95% Confidence Intervals (CIs) and p-values were computed using a Wald t-distribution approximation.

```
library(lme4)
m_lmer <- lmer(Sepal.Length ~ Petal.Length + (1 | Species), data = iris)
report(m_lmer)
```

We fitted a linear mixed model (estimated using REML and nloptwrap optimizer) to predict `Sepal.Length` with `Petal.Length` (formula: `Sepal.Length ~ Petal.Length`). The model included `Species` as random effect (formula: `~1 | Species`). The model's total explanatory power is substantial (conditional  $R^2 = 0.97$ ) and the part related to the fixed effects alone (marginal  $R^2$ ) is of 0.66. The model's intercept, corresponding to `Petal.Length = 0`, is at 2.50 (95% CI [1.19, 3.82],  $t(146) = 3.75$ ,  $p < .001$ ). Within this model:

- The effect of `Petal.Length` is statistically significant and positive ( $\beta = 0.89$ , 95% CI [0.76, 1.01],  $t(146) = 13.93$ ,  $p < .001$ ; Std.  $\beta = 1.89$ , 95% CI [1.63, 2.16])

Standardized parameters were obtained by fitting the model on a standardized version of the dataset. 95% Confidence Intervals (CIs) and p-values were computed using a Wald t-distribution approximation.

```
library(rstanarm)
m_rstan <- stan_glm(mpg ~ qsec + wt, data = mtcars, refresh = 0, iter = 1000)
report(m_rstan)
```

We fitted a Bayesian linear model (estimated using MCMC sampling with 4 chains of 1000 iterations and a warmup of 500) to predict `mpg` with `qsec` and `wt` (formula: `mpg ~ qsec + wt`). Priors over parameters were all set as normal (mean = 0.00, SD = 8.43; mean = 0.00, SD = 15.40) distributions. The model's explanatory power is substantial ( $R^2 = 0.81$ , 95% CI [0.69, 0.89], adj.  $R^2 = 0.79$ ). The model's intercept, corresponding to `qsec = 0` and `wt = 0`, is at 19.59 (95% CI [8.71, 30.63]). Within this model:

- The effect of `qsec` (Median = 0.93, 95% CI [0.38, 1.50]) has a 99.85% probability of being positive ( $> 0$ ), 98.65% of being significant ( $> 0.30$ ), and 0.10% of being large ( $> 1.81$ ). The estimation successfully converged ( $\hat{R} = 1.001$ ) and the indices are reliable (ESS = 2048)
- The effect of `wt` (Median = -5.05, 95% CI [-6.07, -4.05]) has a 100.00% probability of being negative ( $< 0$ ), 100.00% of being significant ( $< -0.30$ ), and 100.00% of being large ( $< -1.81$ ). The estimation successfully converged ( $\hat{R} = 0.999$ ) and the indices are reliable (ESS = 1744)

Following the Sequential Effect eXistence and sIgnificance Testing (SEXIT) framework, we report the median of the posterior distribution and its 95% CI (Highest Density Interval), along the probability of direction (pd), the probability of significance and the probability of being large. The thresholds beyond which the effect is considered as significant (i.e., non-negligible) and large are |0.30| and |1.81| (corresponding respectively to 0.05 and

0.30 of the outcome's SD). Convergence and stability of the Bayesian sampling has been assessed using R-hat, which should be below 1.01 (Vehtari et al., 2019), and Effective Sample Size (ESS), which should be greater than 1000 (Burkner, 2017).

## Tables

If preferred, you can output the information as a table instead.

```
library(insight)
```

```
export_table(format_table(report_table(m_lm)), format = "markdown")
```

Parameter	Coefficient	95% CI	t(29)	p	Std. Coef.	Std. Coef. 95% CI	Fit
(Intercept)	19.75	[ 9.00, 30.49]	3.76	< .001	-1.36e-17	[-0.16, 0.16]	
qsec	0.93	[ 0.39, 1.47]	3.51	0.001	0.28	[ 0.11, 0.44]	
wt	-5.05	[-6.04, -4.06]	-10.43	< .001	-0.82	[-0.98, -0.66]	
AIC							156.72
AICc							158.20
BIC							162.58
R2							0.83
R2 (adj.)							0.81
Sigma							2.60

```
export_table(format_table(report_table(m_lmer)), format = "markdown")
```

Parameter	Coefficient	95% CI	t(146)	p	Effects Group	Std. Coef.	Std. Coef. 95% CI	Fit
(Intercept)	2.50	[1.19, 3.82]	3.75	< .001	fixed	-5.11e-13	[-1.49, 1.49]	
Petal	0.89	[0.76, 1.01]	13.93	< .001	fixed	1.89	[ 1.63, 2.16]	
Length	1.08				randomSpecies			
	0.34				randomResidual			
AIC								127.79
AICc								128.07
BIC								139.84
R2 (conditional)								0.97
R2 (marginal)								0.66
Sigma								0.34

```
export_table(format_table(report_table(m_rstan)), format = "markdown")
```

Parameter	Median	95% CI	pd	Rhat	ESS	Prior	Std. Median	Std. Median 95% CI	Fit
(Intercept)	19.59	[ 8.71, 30.63]	100%	1.001	1907.00	Normal (20.09 +- 15.07)	1.52e-03	[-0.16, 0.16]	
qsec	0.93	[ 0.38, 1.50]	99.85%	1.001	2048.00	Normal (0.00 +- 8.43)	0.28	[ 0.12, 0.44]	
wt	-	[-6.07, 5.05]	100%	0.999	1744.00	Normal (0.00 +- 15.40)	-0.82	[-0.98, -0.65]	
ELPD									-
LOOIC									79.23
WAIC									158.46
R2									158.15
R2 (adj.)									0.81
Sigma									0.79
									2.65

## Grouped Data

You can also seamlessly integrate `{report}` with *tidyverse* workflows:

```
library(dplyr)

iris %>%
  select(-starts_with("Sepal")) %>%
  group_by(Species) %>%
  report() %>%
  summary()
```

The data contains 150 observations, grouped by Species, of the following 3 variables:

- setosa (n = 50):
  - Petal.Length: Mean = 1.46, SD = 0.17, range: [1, 1.90]
  - Petal.Width: Mean = 0.25, SD = 0.11, range: [0.10, 0.60]
- versicolor (n = 50):
  - Petal.Length: Mean = 4.26, SD = 0.47, range: [3, 5.10]
  - Petal.Width: Mean = 1.33, SD = 0.20, range: [1, 1.80]
- virginica (n = 50):
  - Petal.Length: Mean = 5.55, SD = 0.55, range: [4.50, 6.90]
  - Petal.Width: Mean = 2.03, SD = 0.27, range: [1.40, 2.50]

## Conclusion

The `{report}` package is a valuable tool for researchers who use R to analyze data and create reports for publication. It can help standardize and improve results reporting while saving researchers time and improving the quality of their work.

## Licensing and Availability

`{report}` is licensed under the GNU General Public License (v3.0), with all source code openly developed and stored on GitHub (<https://github.com/easystats/report>), along with a corresponding issue tracker for bug reporting and feature enhancements. In the spirit of honest and open science, we encourage requests, tips for fixes, feature updates, as well as general questions and concerns via direct interaction with contributors and developers.

## Acknowledgments

`{report}` is part of the collaborative *easystats* ecosystem. Thus, we thank the [members of easystats](#) as well as the users.

## References

- Lüdtke, D., Makowski, D., Ben-Shachar, M. S., Patil, I., Wiernik, B. M., Bacher, E., & Thériault, R. (2023). *easystats: Streamline model interpretation, visualization, and reporting*. <https://easystats.github.io/easystats/> (Original work published 2019)
- Nuijten, M. B., Hartgerink, C. H., Van Assen, M. A., Epskamp, S., & Wicherts, J. M. (2016). The prevalence of statistical reporting errors in psychology (1985–2013). *Behavior Research Methods*, 48, 1205–1226. <https://doi.org/10.3758/s13428-015-0664-2>