



## Blended Learning Tools for Large Statistics and Mathematics Courses

Achim Zeileis

<http://eeecon.uibk.ac.at/~zeileis/>

# Motivation and challenges

## Motivation:

- Statisticians often teach large lecture courses for other fields.
- Statistics, probability, or mathematics in curricula such as business and economics, social sciences, psychology, etc.
- At WU Wien and Universität Innsbruck: Some courses are attended by more than 1,000 students per semester.
- Several lecturers teach lectures and tutorials in parallel.

## Strategy:

- Individualized organization of learning, feedback, and assessment.
- The same pool of exercises at the core of all parts of the course.

# Motivation and challenges

---

	<b>Learning</b>	<b>Feedback</b>	<b>Assessment</b>
<b>Synchronous</b>	Lecture Live stream	Live quiz (+ Tutorial)	Written exam
<b>Asynchronous</b>	Textbook Screencast	Self test (+ Forum)	Online test

---

# Motivation and challenges

---

	<b>Learning</b>	<b>Feedback</b>	<b>Assessment</b>
<b>Synchronous</b>	Lecture Live stream	Live quiz (+ Tutorial)	Written exam
<b>Asynchronous</b>	Textbook Screencast	Self test (+ Forum)	Online test

---

## Learning:

- *Standard:* Textbook along with presentation slides.
- *Streaming:* Videos streamed simultaneously or (pre-)recorded.

# Motivation and challenges

	<b>Learning</b>	<b>Feedback</b>	<b>Assessment</b>
<b>Synchronous</b>	Lecture Live stream	Live quiz (+ Tutorial)	Written exam
<b>Asynchronous</b>	Textbook Screencast	Self test (+ Forum)	Online test

## Feedback & assessment:

- *Scalability*: Randomized dynamic exercises required.
- *Feedback*: Support for complete correct solutions.
- *Flexibility*: Automatic rendering into different assessment formats.

# R package *exams*

## Tools chosen:

- R for random data generation and computations.
- $\text{\LaTeX}$  for mathematical notation.
- $\text{\LaTeX}$  or Markdown for text formatting
- *Sweave* or *knitr/rmarkdown* for tying everything together.

## Exercises:

- Dynamic templates if R code is used for randomization.
- Each exercise is a single file (either `.Rnw` or `.Rmd`).
- Contains question and (optionally) the corresponding solution.

# R package *exams*

## Answer types:

- Single choice and multiple choice.
- Numeric values.
- Text strings (typically short).
- Combinations of the above (cloze).

## Output:

- PDF – either fully customizable or standardized with automatic scanning/evaluation.
- HTML – either fully customizable or embedded into any of the standard formats below.
- *Moodle XML*.
- QTI XML standard (version 1.2 or 2.1), e.g., for *OLAT/OpenOLAT*.
- *ARShova, TCExam, LOPS, ...*

# Exercises

**Text file:** With sections for random data generation (optional), question, solution (optional), and metainformation.

**Here:** Static multiple-choice question in Markdown format.



# Exercises

**Text file:** With sections for random data generation (optional), question, solution (optional), and metainformation.

**Here:** Static multiple-choice question in Markdown format.

Question

=====

Under the assumptions of the Gauss-Markov theorem the errors of a linear regression model need to be:

Answerlist

-----

- \* independent
- \* uncorrelated
- \* normally distributed
- \* identically distributed
- \* homoscedastic

# Exercises

Solution

=====

Under the assumptions of the Gauss-Markov theorem the errors of a linear regression model need to be uncorrelated, homoscedastic, and with mean zero.

Answerlist

-----

- \* False. Independence is not assumed, only lack of correlation.
- \* True. The errors need to be uncorrelated.
- \* False. No distribution assumption is needed.
- \* False. No distribution assumption is needed.
- \* True. The errors need to be homoscedastic with finite variance.

# Exercises

Solution

=====

Under the assumptions of the Gauss-Markov theorem the errors of a linear regression model need to be uncorrelated, homoscedastic, and with mean zero.

Answerlist

-----

- \* False. Independence is not assumed, only lack of correlation.
- \* True. The errors need to be uncorrelated.
- \* False. No distribution assumption is needed.
- \* False. No distribution assumption is needed.
- \* True. The errors need to be homoscedastic with finite variance.

Meta-information

=====

exname: Gauss-Markov assumptions

extype: mchoice

exsolution: 01001

exshuffle: TRUE

# Exams

**Idea:** An exam is simply a list of exercise templates.

**Draw random exams:**

- First randomly select one exercise from each list element.
- Generate random numbers/input for each selected exercise.
- Combine all exercises in output file(s) (PDF, HTML, ...).

**Interfaces:** `exams2pdf()`, `exams2html()`, `exams2moodle()`,  
`exams2qti12()`, `exams2nops()`, `exams2arsnova()`, ...

# Exams

**Written exam:** Printed PDF files.

- Intended for single- and multiple-choice questions.
- Can be scanned and evaluated automatically within R.
- Limited support for open-ended questions that have to be marked by a person.

**Online test:** In learning management system (*OLAT, Moodle, ...*).

- All exercise types.
- Optionally show complete correct solution.

**Live quiz:** In *ARSnova* on any computer/tablet/smartphone.

- Currently only single- and multiple-choice questions.
- Immediate feedback in lecture room.

# Exams

**Example:** Using statistics exercise templates contained in *exams*.

```
R> myexam <- list(  
+   "boxplots.Rnw",  
+   c("confint.Rnw", "ttest.Rnw", "tstat.Rnw"),  
+   c("anova.Rnw", "regression.Rnw"),  
+   "scatterplot.Rnw",  
+   "relfreq.Rnw"  
+ )
```

**Written exam:**

```
R> exams2nops(myexam[-(2:3)], n = 3, dir = odir,  
+   language = "de", logo = "uibk-logo-bw.png",  
+   institution = "Universit\\\\"at Innsbruck")
```

**Online test:**

```
R> exams2qti12(myexam, n = 3, dir = odir)
```

**Live quiz:**

```
R> exams2arsnova(myexam[-(2:3)], n = 3, dir = odir)
```



# Exams: Written exam





# Exams: Online test

File Edit View History Bookmarks Tools Help

OLAT - OLAT: Course templat... +

138.232.202.96:8080/OLAT-LMS-7.6.0.0/auth/1%3A6%3A1000020776%3A1%: DuckDuckGo

Home Groups Learning resources Group administration User management Administration gui\_demos OLAT Course... Print Help Log out

qt12 Finish test

Actual score: 0 / 5

qt12

1. Exercise Still 1 attempt(s)

1.1. Question 0/0

2. Exercise 0/0

2.1. Question 0/0

3. Exercise 0/0

3.1. Question 0/0

4. Exercise 0/0

4.1. Question 0/0

5. Exercise 0/0

5.1. Question 0/0

### Question

In Figure the distributions of a variable given by two samples (A and B) are represented by parallel boxplots. Which of the following statements are correct? (Comment: The statements are either about correct or clearly wrong.)

Figure 1: Parallel boxplots.

- a. The location of both distributions is about the same.
- b. Both distributions contain no outliers.
- c. The spread in sample A is clearly bigger than in B.
- d. The skewness of both samples is similar.
- e. Distribution A is about symmetric.

Save answer

# Exams: Live quiz

File Edit View History Bookmarks Tools Help

ARSnova: Student - L... x

https://arsnova.uibk.ac.at/mobile/#

Back R/exams/1

1 2 3

In the following figure the distributions of a variable given by two samples (A and B) are represented by parallel boxplots. Which of the following statements are correct? (Comment: The statements are either about correct or clearly wrong.)

A

B

The location of both distributions is about the same.

Start Questions Feedback System Menu

# Discussion

## Package *exams*:

- Framework for automatic generation of exams/tests/quizzes in various formats.
- For a first session employ `exams_skeleton()` which copies demo scripts, exercises, and templates into a working directory.
- Hosted on R-Forge, providing a support forum:  
<http://R-Forge.R-project.org/projects/exams/>

## Under development:

- *Nikolaus Umlauf*: Graphical exams manager based on *shiny* that can be used on a local machine or on a server.
- *Niels Smits*: *Blackboard* interface based on QTI 1.2.
- *Mirko Birbaumer, Achim Zeileis*: *Ilias* interface based on QTI 1.2.
- *Achim Zeileis*: Reports for lecturers based on IRT models.

# References

Zeileis A, Grün B, Leisch F, Umlauf N (2015). *exams: Automatic Generation of Exams in R*. R package version 2.1-0.

URL <http://CRAN.R-project.org/package=exams>

Zeileis A, Umlauf N, Leisch F (2014). “Flexible Generation of E-Learning Exams in R: Moodle Quizzes, OLAT Assessments, and Beyond.” *Journal of Statistical Software*, **58**(1), 1–36. doi:10.18637/jss.v058.i01

Grün B, Zeileis A (2009). “Automatic Generation of Exams in R.” *Journal of Statistical Software*, **29**(10), 1–14. doi:10.18637/jss.v029.i10