

- OpenRepGrid: An R Package for the Analysis of
 Repertory Grid Data
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Software

- Review 🗗
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Introduction

The OpenRepGrid R package is a software to analyze and visualize repertory grid (often abbreviated grid or repgrid) data. The software is open source and available on all major operating systems. The package is also the workhorse on which other packages of the OpenRepGrid project, for example, gridsampler (Heckmann & Burk, 2017) or OpenRepGrid.ic (Heckmann et al., 2023), partially build upon.

Repertory Grid Technique

The repertory grid technique (RGT) is a data collection method which originated from Personal Construct Theory (PCT) (Kelly, 1955). It was originally designed as an instrument for psychotherapy to shed light on a client's construction of the world. Over subsequent decades, the technique has been adopted in many other fields, including market, organizational, political, educational and sensory research (Fransella et al., 2004). The data the RGT generates is qualitative and quantitative. On the qualitative side, the technique elicits the repertory of bipolar attributes (e.g. smart vs. dull, so called constructs in PCT terminology) an individual uses to make distinctions between entities of the world (e.g. different people, so called elements in PCT terminolgy). On the quatitative side, it requires rating each element on each elicited personal construct (e.g. Martin gets a score of 2 on the quarrelsome = 1 vs. peaceful = 6construct, indicating that Martin is quite quarrelsome). The result of the data collection procedure is a data matrix. The constructs are usually presented as matrix rows, the elements as columns and each cell contains the corresponding rating score. Figure 1 depicts a repertory grid data set, with the rows (constructs) and columns (elements) being clustered by similarity (see below for details). A thorough introduction to the repertory grid technique is given by Fransella et al. (2004).



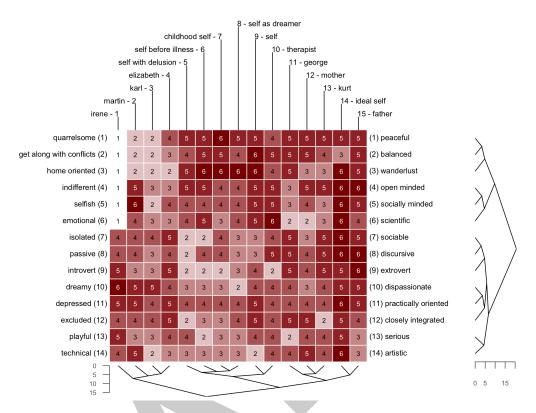


Figure 1: Figure 1. Example of a repertory grid dataset (with rows and columns clustered by similarity).

28 Available Software

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- While it is possible to work with repertory grids directly without further processing, it is common to submit grid data to statistical or mathematical analysis (e.g. Fransella et al., 2004). For this purpose, software packages have been developed since the 1960s (Sewell et al., 1992). Today, several softwares are available on the market, e.g. Enquire Within (Mayes, 2008), GridStat (Bell, 2009), GridCor (Feixas & Cornejo, 2002), Idiogrid (Grice, 2002), Rep 5 (Gaines & Shaw, 2009), GridSuite (Fromm & Bacher, 2006), rep:grid (Rosenberger, 2015). Despite the numerous software packages being available, several issues are common among
 - No grid software offers all methods of grid analysis that have been devised in the
 - None of the available grid programs can be extended by the user, i.e., the user cannot add or modify features. All listed softwares are closed source or at least not available in a public repository.
 - There is no computational framework integrated into the available grid programs to support experimental types of analysis.
 - The output of most grid analysis programs does not easily lend itself to subsequent computation.
 - There is no joint community effort to improve a grid program: The development and documentation is delegated to the software providers, while users or researcher do usually not participate in this process.
 - A lack of community participation in the software development and its closed source nature leads to the problem of discontinued development once its initiators have moved on or retired.



Statement of Need

The OpenRepGrid project was started with the idea of overcoming above mentioned issues. It was designed as an open source project allowing other researchers to contribute, for example, by implementing new features. R was chosen as the programming language as it runs on all major operating systems, gets increasingly popular among academics and is nowadays already taught to undergrads at many universities. The open source nature of R makes it transparent 57 how functions (i.e. methods of grid analysis) are implemented. Also, R and most contributed packages are distributed under a copyleft license. This allows researchers to use or modify existing code for their own needs and redistribute the code under the same license. In total, the obstancles to experimenting and contributing are significantly lowered compared to other 61 softwares on the market.

The open source and collaborative stance of the project may bear another important benefit in terms of scientific progress. Currently, there appears to exist a substantial latency between publication of new grid analysis methods and them being made available to researchers as software features. For example, the structural quadrant method (SQM), a method to assess construct system complexity, devised over 20 years ago by Gallifa & Botella (2000), may serve as an example. The SQM has not been implemented in any grid program, hindering research and discussion of the method. The OpenRepGrid project may help to improve this situation. If researchers decide to build their new method in R from the beginning on, adding their method to the OpenRepGrid package will only be a small additional step. This will facilitate the dissemination of new methods in the research community, leading to a reduction in time-to-market for new methodological ideas. Once the method's code has been tested and 73 documented, it can immediately become part of the OpenRepGrid package and instantly be used by all researchers using grids.

Another reason for the choice of R is its growing ability to easily build graphical user interfaces 76 (GUI) using, for example, the shiny (Chang et al., 2019) and other related R packages. The PCP community is on average not well-versed in programming. This translates into the need 78 for easy to operate, GUI-based software. As shiny does not require knowledge of other web 79 languages (i.e. CSS, HTML, JavaScript) to build a fully operational web application, R is also a suitable choice to fullfill this community need.

Features

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An up-to-date overview of all features implemented in the OpenRepGrid package can be found on the project's documentation site (http://docs.openrepgrid.org.) and in the R package's documentation files, accessible via R Help. The implemented features include the following:

- Data handling: Importing and exporting grid data from different formats, sorting grids, several included datasets (e.g. the boeker dataset, see below)
- Analyzing constructs: Descriptive statistics, correlations, distances, PCA of construct correlations, cluster analysis, aligning constructs
- Analyzing elements: Descriptive statistics, correlations, distances, standardized element distances, cluster analysis
- Visualization: (Clustered) Bertin plots (i.e. heatmaps), biplots, clustering dendrograms
- Indexes: Intensity, complexity, PVAFF, measures of cognitive conflict, implicative dilemmas, etc.

In the remainder, three repgrid visualizations which are frequently used in publications and 95 two types of statistical grid analyses are briefly outlined as feature examples. Figure 1 shows a Bertin diagram (i.e. heatmap) of a grid administered to a schizophrenic patient undergoing psychoanalytically oriented psychotherapy (Böker, 1996). The data was taken during the last stage of therapy. The data for this example is already included in the package. The ratings in the grid are color-coded allowing to spot similar rating patterns. Also, the grid was submitted



to hierarchical cluster analysis, thereby reordering the constructs and elements by similarity as indicated by the dendrograms printed alongside the diagram. The following code creates the diagram shown in Figure 1.

```
bertinCluster(boeker, colors = c("white", "darkred"))
```

Figure 2 shows a biplot of the grid data from Figure 1. A biplot is the generalization of a scatterplot from two to many axes, all displayed in a single plot. It allows reading off the approximate score of each element on each construct by projecting an element's position in the plot on the construct axes (Greenacre, 2010; Slater, 1977). In the biplot, it can, for example, be seen that the "father" is the element construed most closely to the "ideal self". Biplots of grid data are generally useful to generate transparency of the individual's overall construction of the elements and their similarity. Figure 2 is created by the following code.

biplot2d(boeker)

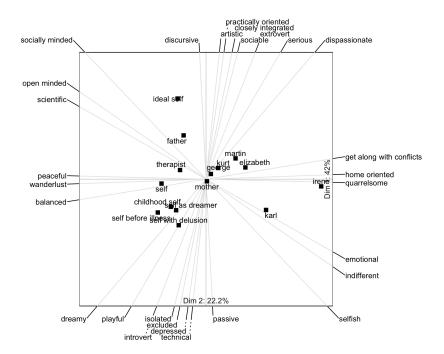


Figure 2: Figure 2. Biplot of Böker's dataset.

Figure 3 shows the dendrogram for the elements, here the result of a hierarchical cluster analysis using Ward's method with a Euclidean distances measure. Using an approach suggested by Heckmann & Bell (2016), the dendrogram structures are also tested for stability. Stable or significant structures are framed in a rectangle, indicating that "childhood self", "self before illness", "self with delusion", and "self as dreamer" forms a stable group of elements. Figure 3 is created by the following code.

```
s <- clusterBoot(boeker, along = 2, seed = 123)
plot(s)
pvrect(s, max.only = FALSE)</pre>
```



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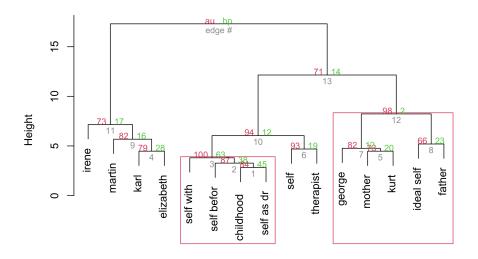
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Cluster dendrogram with p-values (%)



Distance: euclidean Cluster method: ward.D

Figure 3: Figure 3. Dendrogram of clustering results.

Inter-element distances are a commonly applied measure in the statistical analysis of grid data (Fransella et al., 2004). As already shown in the biplot example above, distances between elements indicate which elements (i.e. persons) are construed as similar. One distance of particular intererest in psychotherapy research is the self-ideal distance as it may provide useful clinical indications (e.g. Taylor et al., 2020). But also in other areas, for example, in market research element distances are frequently used in the analysis (e.g. Hauser et al., 2011). In most cases, the Euclidean distance is selected as a distance measure. As the maximal Euclidean distances between two elements depends on the rating scale and the number of constructs in a grid, several approaches to standardizing inter-element distances have been suggested. One well known approach which has come to be known as Slater distances, divides the inter-element distance by its expected value (Slater, 1977). However, Hartmann (1992) showed in a simulation study that Slater distances have a skewed distribution, as well as a mean and a standard deviation depending on the number of elicited constructs. Hartmann suggested an improvement measure by applying a transformation to standardize Slater distances across different grid sizes. This development serves as another example of above mentioned situation, as to the best of my knowledge, Hartmann distances are currently only implemented in OpenRepGrid and no other grid software. Hartmann distances can be calculated using the following code.

distanceHartmann(boeker[, 1:9]) # here only subset of elements, to fit PDF page

```
##############################
    Distances between elements
136
    ##############################
137
    Distance method:
                        Hartmann (standardized Slater distances)
139
    Normalized:
140
                            1
                                   2
                                          3
                                                 4
                                                        5
                                                               6
                                                                      7
                                                                             8
                                                                                    9
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```



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```
(1) self
                            -0.44 0.67 1.40 -0.08 -1.69 0.51 -0.93 -0.39
   (2) ideal self
                                          0.54 -1.35 -3.34 -1.57 -1.01 -2.06
1/13
   (3) mother
                                          0.77 2.17 -0.58 2.08 0.29
                                                                          1.81
                   3
   (4) father
                   4
                                                1.58 -2.19
                                                            1.40 -0.67
                                                                          0.23
                                                      -0.34 1.90
   (5) kurt
                                                                   0.21
                                                                          2.05
146
                                                            -0.68
                                                                   0.76
                                                                          1.15
   (6) karl
                   6
147
                   7
   (7) george
                                                                   -0.72
                                                                          1.52
   (8) martin
                   8
                                                                          1.10
149
   (9) elizabeth
                   9
150
```

For calculation the parameters from Hartmann (1992) were used. Use 'method=new' or metho

The last feature example concers the detection of implicative dilemmas. Implicative dilemmas represent a form of cognitive conflict. An implicative dilemma arises when a desired change on one construct is associated with an undesired change on another construct. For example, a *timid* person may wish to become more *socially skilled* but associates being more socially skilled with several negative characteristics (selfish, insensitive etc.). The person might, for example, construe the implication of becoming less timid (desired) as becoming more selfish (undesired) at the same time (Winter, 1982). As a consequence, the person may resist to the desired change if the presumed implications will threaten the person's identity and the predictive power of his construct system. The investigation of the role of implicative dilemmas in different mental disorders is an active field of research in Personal Construct Psychology (Dorough et al., 2007; e.g. Feixas & Saúl, 2004; Rouco et al., 2019). Implicative dilemma can be detected using the indexDilemma function. For the dataset above, the results show that a desired change on the discrepant contruct *balanced - get along with conflicts* towards the *get along with conflicts* pole implies four undesired changes, for example, to become more *indifferent* and less *peaceful*.

```
id <- indexDilemma(boeker, self = 1, ideal = 2)</pre>
    #####################
    Implicative Dilemmas
169
    ######################
170
171
172
173
    SUMMARY:
174
175
    No. of Implicative Dilemmas (IDs): 4
176
    No. of possible construct pairs: 91
177
    Percentage of IDs (PID): 4.4% (4/91)
178
    Intensity of IDs (IID): 61.3
179
    Proportion of the intensity of constructs of IDs (PICID): 2.7
180
181
182
    PARAMETERS:
184
185
    Self: Element No. 1 = self
186
   Ideal: Element No. 2 = ideal self
187
188
   Correlation Criterion: >= 0.35
189
   Note: Correlation calculated including elements Self & Ideal
190
   Criteria (for construct classification):
192
```



```
Discrepant if Self-Ideal difference: >= 3
    Congruent if Self-Ideal difference: <= 1
194
195
196
197
   CLASSIFICATION OF CONSTRUCTS:
198
       Note: Constructs aligned so 'Self' corresponds to left pole
200
201
                                   Construct Self Ideal Difference Classification
202
       balanced - get along with conflicts
                                                        4
                                                                          discrepant
203
   1
                                                 1
                                                                    3
                                                 3
   2
                        isolated - sociable
                                                        6
                                                                    3
                                                                          discrepant
   3
                                                 2
                                                        2
             closely integrated - excluded
                                                                           congruent
205
   4
                       passive - discursive
                                                 3
                                                        6
                                                                    3
                                                                          discrepant
   5
                  open minded - indifferent
                                                        1
                                                                    1
                                                                           congruent
   6
                     dispassionate - dreamy
                                                 3
                                                        2
                                                                    1
                                                                            congruent
                                                 2
   7
          practically oriented - depressed
                                                                           congruent
209
                                                        1
                          serious - playful
   8
                                                 3
210
                                                        2
                                                                            congruent
                                                 2
   9
                  socially minded - selfish
                                                        1
                                                                    1
                                                                            congruent
   10
                     peaceful - quarrelsome
                                                 2
                                                        2
                                                                    0
                                                                           congruent
212
   11
                       technical - artistic
                                                        6
                                                                    4
                                                                          discrepant
213
                     scientific - emotional
   12
                                                 2
                                                        1
                                                                    1
                                                                           congruent
214
                      extrovert - introvert
                                                 3
                                                        2
215
   13
                                                                    1
                                                                            congruent
                wanderlust - home oriented
                                                                            congruent
216
217
218
219
    IMPLICATIVE DILEMMAS:
220
221
       Note: Congruent constructs on the left - Discrepant constructs on the right
222
223
                             Congruent
                                                                      Discrepant
224
        5. open minded - indifferent 1. balanced - get along with conflicts 0.53
225
   1
226
   2
        9. socially minded - selfish 1. balanced - get along with conflicts 0.36
          10. peaceful - quarrelsome 1. balanced - get along with conflicts 0.84 *Not implem
227
    4 14. wanderlust - home oriented 1. balanced - get along with conflicts 0.72
228
229
        R = Correlation including Self & Ideal
230
231
        RexSI = Correlation excluding Self & Ideal
        R was used as criterion
232
   The implied dilemmas can also be visualized as a network graph.
    plot(id)
```



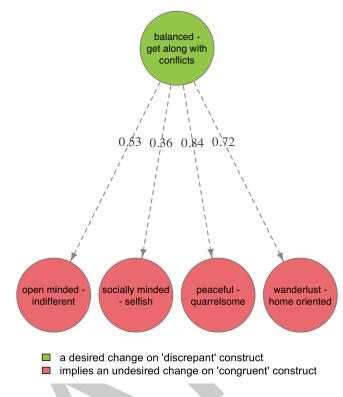


Figure 4: Figure 4. Network graph of implicative dilemmas.

4 Contributing

In order to maximize the package's usefulness for the grid research community, we welcome participation in the package's further development. Experienced R programmers are asked to make pull requests to the OpenRepGrid github repository, report issues, or commit code snippets by email. Non-technical oriented researchers without programming knowledge are invited to send us feature requests or suggestions for collaboration, for example, to jointly develop and implement a new repgrid analysis method. The goal is to make OpenRepGrid useful for the majority of the repgrid community which will only be possible via research community participation.

43 Acknowledgements

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