Diagrams and Procedures for Partition of Variation

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processed with vegan 2.4-0 in R Under development (unstable) (2016-06-15 r70789) on June $15,\,2016$

Diagrams describing the partitions of variation of a response data table by two (Fig. 1), three (Fig. 2) and four tables (Fig. 3) of explanatory variables. The fraction names [a] to [p] in the output of varpart function follow the notation in these Venn diagrams, and the diagrams were produced using the showvarparts function.

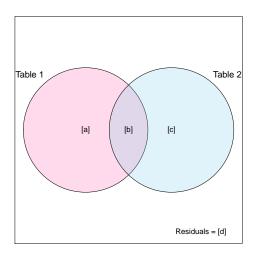


Figure 1: 3 regression/canonical analyses and 3 subtraction equations are needed to estimate the $4 (= 2^2)$ fractions.

[a] and [c] can be tested for significance (3 canonical analyses per permutation). Fraction [b] cannot be tested singly.

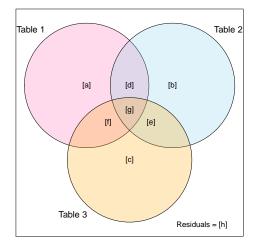


Figure 2: 7 regression/canonical analyses and 10 subtraction equations are needed to estimate the $8 = 2^3$ fractions.

[a] to [c] and subsets contain-

[a] to [c] and subsets containing [a] to [c] can be tested for significance (4 canonical analyses per permutation to test [a] to [c]). Fractions [d] to [g] cannot be tested singly.

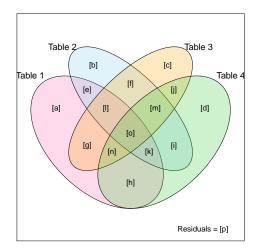


Figure 3: 15 regression/canonical analyses and 27 subtraction equations are needed to estimate the $16 (= 2^4)$ fractions.

[a] to [d] and subsets containing [a] to [d] can be tested for significance (5 canonical analyses per permutation to test [a] to [d]). Fractions [e] to [o] cannot be tested singly.

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Variation partitioning for two explanatory data tables --
Table 1 with m1 explanatory variables, Table 2 with m2 explanatory variables Number of fractions: 4, called [a] ... [d]
   indicates the 3 regression or canonical analyses that have to be computed.
# Partial canonical analyses are only computed if tests of significance or biplots are needed.
Compute Fitted Residuals Derived fractions
                                                                                                                                                    Degrees of freedom, numerator of F
√ Y.1
                       \Gamma a+b \Gamma
                                             [c+d] (1)
                                                                                                                                                     df(a+b) = m1
                                             [a+d] (2)
√ Y.2
                       Γb+c1
                                                                                                                                                     df(b+c) = m2
                                               [d]
[d]
√ Y.1,2
                       [a+b+c]
                                                         (3)
                                                                                                                                                     df(a+b+c) = m3 \le m1+m2 (there may be collinearity)
                                                                                                                                                    df(a) = m3-m2

df(c) = m3-m1
# Y.1Í2
                       [a]
# Y.2|1
                      \Gamma c I
Partial analyses (4) [a] = [a+b+c] - [b+c]

controlling for 1 table X (5) [c] = [a+b+c] - [a+b]

(6) [b] = [a+b] + [b+c] - [a+b+c]

(7) [d] = residuals = 1 - [a+b+c]
                                                                                                                                                     df(a) = m3-m2*
                                                                                                                                                    df(c) = m3-m1*

df(b) = m1+m2-(m1+m2) = 0
                                                                                                                                                     df2(d) = n-1-m3 for denominator of F
* Calculation of d.f. for difference between nested models: see Sokal & Rohlf (1981, 1995) equation 16.14.
Tests of significance --
F(a+b) = ([a+b]/m1)/([c+d]/(n-1-m1))

F(b+c) = ([b+c]/m2)/([a+d]/(n-1-m2))
F(a+b+c) = ([a+b+c]/m3)/([d]/(n-1-m3))
F(a) = ([a]/(m3-m2))/([d]/(n-1-m3))

F(c) = ([c]/(m3-m1))/([d]/(n-1-m3))
The only testable fractions are those that can be obtained directly by regression or canonical analysis.
The non-testable fraction is [b]. That fraction cannot be obtained directly by regression or canonical analysis.
Variation partitioning for three explanatory data tables --
Table 1 with m1 explanatory variables, Table 2 with m2 explanatory variables, Table3 with m3 explanatory variables Number of fractions: 8, called [a] ... [h] √ indicates the 7 regression or canonical analyses that have to be computed.
# Partial canonical analyses are only computed if tests of significance or biplots are needed.
Compute Fitted
                                                      Residuals Derived fractions
                                                                                                                                                                           Degrees of freedom, numerator of F
Direct canonical analysis
                                                     [b+c+e+h] (1)

[a+c+f+h] (2)

[a+b+d+h] (3)

[c+h] (4)

[b+h] (5)

[a+h] (6)

g] [h] (7)
                      [a+d+f+g]
[b+d+e+g]
√ Y.1
√ Y.2
                                                                                                                                                                           df(a+d+f+q) = m1
                                                                                                                                                                           df(b+d+e+g) = m2
                                                                                                                                                                          \begin{array}{lll} df(c+e+f+g) = m3 \\ df(a+b+d+e+f+g) = m4 \leq m1+m2 \; (collinearity?) \\ df(a+c+d+e+f+g) = m5 \leq m1+m3 \; (collinearity?) \\ df(b+c+d+e+f+g) = m6 \leq m2+m3 \; (collinearity?) \\ df(a+b+c+d+e+f+g) = m7 \leq m1+m2+m3 \; (collinearity?) \\ df(a+f) = m4-m2 \\ df(a+d) = m5-m3 \\ df(b+e) = m4-m1 \\ df(b+d) = m6-m3 \\ df(c+e) = m5-m1 \end{array}
   Y.3
                        [c+e+f+g]
                                                                                                                                                                           df(c+e+f+g) = m3
                       [a+b+d+e+f+g]
   Y.1.2
   Y.1,3
                       [a+c+d+e+f+g]
                      [b+c+d+e+f+g]
[a+b+c+d+e+f+g]
   Y.2,3
   Y.1,2,3
Y.1|2
                       Γa+f7
                                                                [b+h]
                       [a+d]
# Y.211
                       [b+e]
                                                                [c+h]
# Y.213
                       Γb+d1
                                                                Γa+h 🧵
                                                                [b+h]
                                                                                                                                                                           df(c+e) = m5-m1
# Y.3|1
                       [c+e]
# Y.3|2
                                                                [a+h]
                                                                                                                                                                           df(c+f) = m6-m2
                                                                                                                                                                           df(a) = m7-m6

df(b) = m7-m5

df(c) = m7-m4
# Y.1|2,3 [a]
                                                                   [h]
   Y.2|1.3
                      ГЬТ
                                                                    df(a) = m7-m6
df(b) = m7-m5
Partial analyses
controlling for two tables X
                                                                                                                                                                           df(c) = m7-m4
controlling for one table X
                                                                    (11) [a+d] = [a+c+d+e+f+g]
                                                                                                                                - [c+e+f+a]
                                                                                                                                                                           df(a+d) = m5-m3
                                                                    (12)
                                                                               [a+f] =
                                                                                                 [a+b+d+e+f+g]
                                                                                                                                      [b+d+e+g]
                                                                                                                                                                           df(a+f) = m4-m2
                                                                    (13) [b+d] = [b+c+d+e+f+g]
(14) [b+e] = [a+b+d+e+f+g]
                                                                                                                                     [c+e+f+g]
[a+d+f+g]
                                                                                                                                                                           df(b+d) = m6-m3
                                                                                                                                                                           df(b+e) = m4-m1

df(c+e) = m5-m1
                                                                                                 [a+c+d+e+f+g]
                                                                    (16) [c+f]
                                                                                            = [b+c+d+e+f+g] - [b+d+e+g]
                                                                                                                                                                           df(c+f) = m6-m2
                                                                    (17) [d] = [a+d] - [a]
                                                                                                                                                                           df(d) = m1-m1 = 0
Fractions estimated
                                                                   (17) [a] = [a+a] - [a]

(18) [e] = [b+e] - [b]

(19) [f] = [c+f] - [c]

(20) [g] = [a+b+c+d+e+f+g]-[a+d]-[b+e]-[c+f]

or [g] = [a+d+f+g] - [a] - [d] - [f]

(21) [h] = residuals = 1 - [a+b+c+d+e+f+g]
                                                                                                                                                                           df(e) = m2-m2 = 0

df(f) = m3-m3 = 0
by subtraction
(cannot be tested)
                                                                                                                                                                          df(g) = (m1+m2+m3)-m1-m2-m3 = 0

df(g) = m1-m1-0-0 = 0
                                                                                                                                                                           df2(h) = n-1-m7 for denominator of F
Tests of significance --
 \begin{split} F(a+d+f+g) &= ([a+d+f+g]/m1)/([b+c+e+h]/(n-1-m1)) \\ F(b+d+e+g) &= ([b+d+e+g]/m2)/([a+c+f+h]/(n-1-m2)) \\ F(c+e+f+g) &= ([c+e+f+g]/m3)/([a+b+d+h]/(n-1-m3)) \end{split} 
 F(a+b+d+e+f+g) = ([a+b+d+e+f+g]/m4)/([c+h]/(n-1-m4)) 
 F(a+c+d+e+f+g) = ([a+c+d+e+f+g]/m5)/([b+h]/(n-1-m5)) 
 F(b+c+d+e+f+g) = ([b+c+d+e+f+g]/m6)/([a+h]/(n-1-m6)) 
F(a+b+c+d+e+f+g) = ([a+b+c+d+e+f+g]/m7)/([h]/(n-1-m7))
 \begin{split} F(a) &= ([a]/(m7-m6))/([h]/(n-1-m7)) \\ F(b) &= ([b]/(m7-m5))/([h]/(n-1-m7)) \\ F(c) &= ([c]/(m7-m4))/([h]/(n-1-m7)) \\ F(a+d) &= ([a+d]/(m5-m3))/([b+h]/(n-1-m5)) \\ F(a+f) &= ([a+f]/(m4-m2))/([c+h]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m2))/([c+h]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m2))/([c+h]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m2))/([a+f]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m4))/([a+f]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m4))/([a+f]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m4))/([a+f]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m4))/([a+f]/(n-1-m4)) \\ F(a+f) &= ([a+f]/(m4-m4))/([a+f]/(
F(b+d) = ([b+d]/(m6-m3))/([a+h]/(n-1-m6))

F(b+e) = ([b+e]/(m4-m1))/([c+h]/(n-1-m4))

F(c+e) = ([c+e]/(m5-m1))/([b+h]/(n-1-m5))
F(c+f) = ([c+f]/(m6-m2))/([a+h]/(n-1-m6))
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The only testable fractions are those that can be obtained directly by regression or canonical analysis.

Variation partitioning for four explanatory data tables -- Table 1 with m1 variables, Table 2 with m2 variables, Table 3 with m3 variables, Table4 with m4 variables Number of fractions: 16, called [a] \dots [p]. \checkmark indicates the 15 regression or canonical analyses that have to be computed.

√ indicates the 15 regression or canonical analyses that have to be computed.				
Compute	Fitted	Residuals	Derived fractions	Degrees of freedom
√ Y.1 √ Y.2 √ Y.3 √ Y.4 √ Y.1,2 √ Y.1,3 √ Y.1,4 √ Y.2,3 √ Y.2,4 √ Y.3,4 √ Y.1,2,3 √ Y.1,2,3 √ Y.1,2,3 √ Y.1,2,3	nical analysis [a+e+g+h+k+l+n+o] [b+e+f+i+k+l+m+o] [c+f+g+j+l+m+n+o] [d+h+i-j+k+m+n+o] [a+b+e+f+g+h+i+k+l+m+n+o] [a+c+e+f+g+h+i+k+l+m+n+o] [a+d+e+g+h+i+j+k+l+m+n+o] [b+d+e+f+h+i+j+k+l+m+n+o] [c+d+f+g+h+i+j+k+l+m+n+o] [a+b+c+e+f+g+h+i+j+k+l+m+n+o] [a+b+c+e+f+g+h+i+j+k+l+m+n+o] [a+b+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o] [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o]	[c+p] [b+p] [a+p]	(2) (3) (4) (5) (6) (7) (8)	$\begin{array}{lll} df(a+e+g+h+k+l+n+o) &= m1 \\ df(b+e+f+i+k+l+m+o) &= m2 \\ df(c+f+g+j+l+m+n+o) &= m3 \\ df(d+h+1+j+k+m+n+o) &= m3 \\ df(d+h+1+j+k+m+n+o) &= m5 \\ df(a+b+e+f+g+h+i+k+l+m+n+o) &= m5 \\ &\leq m1+m3 \\ df(a+d+e+g+h+j+k+l+m+n+o) &= m7 \\ &\leq m1+m3 \\ df(b+c+e+f+g+h+j+k+l+m+n+o) &= m8 \\ &\leq m2+m3 \\ df(b+c+e+f+g+h+j+k+l+m+n+o) &= m8 \\ &\leq m2+m3 \\ df(b+c+e+f+g+i+j+k+l+m+n+o) &= m9 \\ &\leq m2+m3 \\ df(c+d+e+f+g+h+i+j+k+l+m+n+o) &= m10 \\ &\leq m3+m4 \\ df(a+b+c+e+f+g+h+i+j+k+l+m+n+o) &= m111 \\ &\leq m1+m2+m3 \\ df(a+b+d+e+f+g+h+i+j+k+l+m+n+o) &= m13 \\ &\leq m1+m3+m4 \\ df(a+b+c+e+f+g+h+i+j+k+l+m+n+o) &= m13 \\ &\leq m2+m3+m4 \\ df(a+b+c+d+e+f+g+h+i+j+k+l+m+n+o) &= m15 \\ &\leq m1+m2+m3+m4 \\ df(a+b+c+d+e+f+g+h+i+j+k+l+m+n+o) &= m15 \\ &\leq m1+m2+m3+m4 \\ &\leq$
Partial analyses controlling for one table X		(17) [a+g+h+n] = [a+b+e+f+g+h+i+k+l+m+n+o] - [b+e+f+i+k+l+m+o]) [a+e+h+k] = [a+c+e+f+g+h+j+k+l+m+n+o] - [c+f+g+j+l+m+n+o]) [a+e+g+l] = [a+d+e+g+h+i+j+k+l+m+n+o] - [d+h+i+j+k+m+n+o]	$ df(\alpha + g + h + n) = m5 - m2 \\ df(\alpha + e + h + k) = m6 - m3 \\ df(\alpha + e + g + 1) = m7 - m4 $
		(20) [b+f+i+m] = [a+b+e+f+g+h+i+k+l+m+n+o] - [a+e+g+h+k+l+n+o]) [b+e+i+k] = [b+c+e+f+g+i+j+k+l+m+n+o] - [c+f+g+j+l+m+n+o]) [b+e+f+l] = [b+d+e+f+h+i+j+k+l+m+n+o] - [d+h+i+j+k+m+n+o]	<pre>df(b+f+i+m) = m5 - m1 df(b+e+i+k) = m8 - m3 df(b+e+f+l) = m9 - m4</pre>
		(23) [c+f+j+m] = [a+c+e+f+g+h+j+k+l+m+n+o] - [a+e+g+h+k+l+n+o]) [c+g+j+n] = [b+c+e+f+g+i+j+k+l+m+n+o] - [b+e+f+i+k+l+m+o]) [c+f+g+l] = [c+d+f+g+h+i+j+k+l+m+n+o] - [d+h+i+j+k+m+n+o]	df(a) = m6 - m1 df(a) = m8 - m2 df(a) = m10 - m4
		(26) [d+i+j+m] = [a+d+e+g+h+i+j+k+l+m+n+o] - [a+e+g+h+k+l+n+o]) [d+h+j+n] = [b+d+e+f+h+i+j+k+l+m+n+o] - [b+e+f+i+k+l+m+o]) [d+h+i+k] = [c+d+f+g+h+i+j+k+l+m+n+o] - [c+f+g+j+l+m+n+o]	df(a) = m7 - m1 df(a) = m9 - m2 df(a) = m10 - m3
controlling for two tables X		(29) [a+e] = [a+c+d+e+f+g+h+i+j+k+l+m+n+o]-[c+d+f+g+h+i+j+k+l+m+n+o]) [a+g] = [a+b+d+e+f+g+h+i+j+k+l+m+n+o]-[b+d+e+f+h+i+j+k+l+m+n+o]) [a+h] = [a+b+c+e+f+g+h+i+j+k+l+m+n+o]-[b+c+e+f+g+i+j+k+l+m+n+o]	$\begin{array}{lll} df(\alpha + e) &= \text{m13} &- \text{m10} \\ df(\alpha + g) &= \text{m12} &- \text{m9} \\ df(\alpha + h) &= \text{m11} &- \text{m8} \end{array}$
		(32) [b+e] = [b+c+d+e+f+g+h+i+j+k+l+m+n+o]-[c+d+f+g+h+i+j+k+l+m+n+o]) [b+f] = [a+b+d+e+f+g+h+i+j+k+l+m+n+o]-[a+d+e+g+h+i+j+k+l+m+n+o]) [b+i] = [a+b+c+e+f+g+h+i+j+k+l+m+n+o]-[a+c+e+f+g+h+j+k+l+m+n+o]	$\begin{array}{lll} df(b+e) &= m14 &- m10 \\ df(b+f) &= m12 &- m7 \\ df(b+i) &= m11 &- m6 \end{array}$
		(35) [c+f] = [a+c+d+e+f+g+h+i+j+k+l+m+n+o]-[a+d+e+g+h+i+j+k+l+m+n+o]) [c+g] = [b+c+d+e+f+g+h+i+j+k+l+m+n+o]-[b+d+e+f+h+i+j+k+l+m+n+o]) [c+j] = [a+b+c+e+f+g+h+i+j+k+l+m+n+o]-[a+b+e+f+g+h+i+k+l+m+n+o]	$ \begin{array}{llllllllllllllllllllllllllllllllllll$
		(38) [d+h] = [b+c+d+e+f+g+h+i+j+k+l+m+n+o]-[b+c+e+f+g+i+j+k+l+m+n+o]) [d+i] = [a+c+d+e+f+g+h+i+j+k+l+m+n+o]-[a+c+e+f+g+h+j+k+l+m+n+o]) [d+j] = [a+b+d+e+f+g+h+i+j+k+l+m+n+o]-[a+b+e+f+g+h+i+k+l+m+n+o]	$ \begin{array}{llllllllllllllllllllllllllllllllllll$
controlling	for three tables X	(41 (42) [a] = [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o] - [b+c+d+e+f+g+h+i+j+k+l+m+n+o]) [b] = [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o] - [a+c+d+e+f+g+h+i+j+k+l+m+n+o]) [c] = [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o] - [a+b+d+e+f+g+h+i+j+k+l+m+n+o]) [d] = [a+b+c+d+e+f+g+h+i+j+k+l+m+n+o] - [a+b+c+e+f+g+h+i+j+k+l+m+n+o]	df(a) = m15 - m14 df(b) = m15 - m13 df(c) = m15 - m12 df(d) = m15 - m11
Fractions e (cannot be	stimated by subtraction tested)	(45) (46) (47) (48) (50) (51) (52) (53) (54)	[e] = [a+e] - [a]	<pre>df(e) = m1-m1 = 0 df(f) = m2-m2 = 0 df(g) = m1-m1 = 0 df(h) = m1-m1 = 0 df(h) = m2-m2 = 0 df(j) = m3-m3 = 0 df(j) = m3-m3 = 0 df(j) = m2-m2 - 0 df(j) = m1-m1-0 = 0 df(m) = m2-m2 - 0 df(m) = m1-m1-0 = 0 df(o) = m1-m1-0 = 0</pre>

Tests of significance --F(a+e+g+h+k+l+n+o) = ([a+e+g+h+k+l+n+o]/m1)/([b+c+d+f+i+j+m+p]/(n-1-m1))F(b+e+f+i+k+l+m+o) = ([b+e+f+i+k+l+m+o]/m2)/([a+c+d+g+h+j+n+p]/(n-1-m2))F(c+f+g+j+l+m+n+o] = ([c+f+g+j+l+m+n+o]/m3)/([a+b+d+e+h+i+k+p]/(n-1-m3))F(a+d+e+g+h+i+j+k+l+m+n+o) = ([a+d+e+g+h+i+j+k+l+m+n+o]/m7)/([b+c+f+p]/(n-1-m7))| The control of the F(a+b+c+e+f+g+h+i+j+k+l+m+n+o) = ([a+b+c+e+f+g+h+i+j+k+l+m+n+o]/m11)/([d+p]/(n-1-m11))F(a+b+d+e+f+g+h+i+j+k+l+m+n+o) = ([a+b+d+e+f+g+h+i+j+k+l+m+n+o]/m12)/([c+p]/(n-1-m12)) F(a+c+d+e+f+g+h+i+j+k+l+m+n+o) = ([a+c+d+e+f+g+h+i+j+k+l+m+n+o]/m13)/([b+p]/(n-1-m13)) F(b+c+d+e+f+g+h+i+j+k+l+m+n+o) = ([b+c+d+e+f+g+h+i+j+k+l+m+n+o]/m13)/([b+p]/(n-1-m14)) F(a+b+c+d+e+f+g+h+i+j+k+l+m+n+o) = ([a+b+c+d+e+f+g+h+i+j+k+l+m+n+o]/m15)/([p]/(n-1-m15))F(a+g+h+n) = ([a+g+h+n]/(m5-m2))/([c+d+j+p]/(n-1-m5))For the other fractions controlling for one table X, the F-statistics are constructed in the same way F(a+e) = ([a+e]/(m13-m10))/([b+p]/(n-1-m13))For the other fractions controlling for two tables X, the F-statistics are constructed in the same way Fractions controlling for three tables X: F(a) = ([a]/(m15-m14))/([p]/(n-1-m15))F(b) = ([b]/(m15-m13))/([p]/(n-1-m15))F(c) = ([c]/(m15-m12))/([p]/(n-1-m15))F(d) = ([d]/(m15-m11))/([p]/(n-1-m15))Other fractions combining elementary fractions [a] to [o] can be calculated, but cannot be tested because they cannot be obtained by regression.
