# betaSandwich: Staging

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Staging...

#### References

Pesigan, I. J. A., Sun, R. W., & Cheung, S. F. (2023). betaDelta and betaSandwich: Confidence intervals for standardized regression coefficients in R. *Multivariate Behavioral Research*, 58(6), 1183–1186. https://doi.org/10.1080/00273171.2023.2201277

R Core Team. (2024). R: A language and environment for statistical computing. R Foundation for Statistical Computing. Vienna, Austria. https://www.R-project.org/

## 1 Standardized Slopes

```
df <- nas1982
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = df)
mvn <- BetaN(object)</pre>
adf <- BetaADF(object)</pre>
hc3 <- BetaHC(object, type = "hc3")
summary(mvn)
#> Call:
#> BetaN(object = object)
#> Standardized regression slopes with MVN standard errors:
             est
                    se
                         t df p 0.05%
                                                   0.5% 2.5% 97.5% 99.5%
#> NARTIC 0.4951 0.0759 6.5272 42 0.000 0.2268 0.2905 0.3421 0.6482 0.6998
#> PCTGRT 0.3915 0.0770 5.0824 42 0.000 0.1190 0.1837 0.2360 0.5469 0.5993
#> PCTSUPP 0.2632 0.0747 3.5224 42 0.001 -0.0011 0.0616 0.1124 0.4141 0.4649
           99.95%
#> NARTIC 0.7635
#> PCTGRT 0.6640
#> PCTSUPP 0.5276
summary(adf)
#> Call:
```

```
#> BetaADF(object = object)
#>
#> Standardized regression slopes with MVN standard errors:
   est se t df p 0.05% 0.5% 2.5% 97.5% 99.5%
#> NARTIC 0.4951 0.0674 7.3490 42 0.0000 0.2568 0.3134 0.3592 0.6311 0.6769
#> PCTGRT 0.3915 0.0710 5.5164 42 0.0000 0.1404 0.2000 0.2483 0.5347 0.5830
#> PCTSUPP 0.2632 0.0769 3.4231 42 0.0014 -0.0088 0.0558 0.1081 0.4184 0.4707
         99.95%
#> NARTIC 0.7335
#> PCTGRT 0.6426
#> PCTSUPP 0.5353
summary(hc3)
#> Call:
#> BetaHC(object = object, type = "hc3")
#> Standardized regression slopes with HC3 standard errors:
#> est se t df p 0.05% 0.5% 2.5% 97.5% 99.5%
#> NARTIC 0.4951 0.0786 6.3025 42 0.0000 0.2172 0.2832 0.3366 0.6537 0.7071
#> PCTGRT 0.3915 0.0818 4.7831 42 0.0000 0.1019 0.1707 0.2263 0.5567 0.6123
#> PCTSUPP 0.2632 0.0855 3.0786 42 0.0037 -0.0393 0.0325 0.0907 0.4358 0.4940
#>
         99.95%
#> NARTIC 0.7731
#> PCTGRT 0.6810
#> PCTSUPP 0.5658
coef(mvn)
#> NARTIC PCTGRT PCTSUPP
#> 0.4951451 0.3914887 0.2632477
coef(adf)
#> NARTIC PCTGRT PCTSUPP
#> 0.4951451 0.3914887 0.2632477
coef(hc3)
#> NARTIC PCTGRT PCTSUPP
#> 0.4951451 0.3914887 0.2632477
vcov(mvn)
               NARTIC
                           PCTGRT
                                      PCTSUPP
#> NARTIC 0.005754524 -0.003360334 -0.002166127
#> PCTGRT -0.003360334 0.005933462 -0.001769723
#> PCTSUPP -0.002166127 -0.001769723 0.005585256
```

```
vcov(adf)
                NARTIC
                           PCTGRT
#>
                                        PCTSUPP
#> NARTIC 0.004539472 -0.002552698 -0.001742698
#> PCTGRT -0.002552698 0.005036538 -0.001906216
#> PCTSUPP -0.001742698 -0.001906216 0.005914088
vcov(hc3)
#>
                NARTIC
                           PCTGRT PCTSUPP
#> NARTIC 0.006172168 -0.003602529 -0.001943469
#> PCTGRT -0.003602529 0.006699155 -0.002443584
#> PCTSUPP -0.001943469 -0.002443584 0.007311625
confint(mvn)
            2.5 % 97.5 %
#> NARTIC 0.3420563 0.6482339
#> PCTGRT 0.2360380 0.5469395
#> PCTSUPP 0.1124272 0.4140682
confint(adf)
            2.5 % 97.5 %
#> NARTIC 0.3591757 0.6311146
#> PCTGRT 0.2482683 0.5347091
#> PCTSUPP 0.1080509 0.4184444
confint(hc3)
               2.5 % 97.5 %
#> NARTIC 0.33659828 0.6536920
#> PCTGRT 0.22631203 0.5566654
#> PCTSUPP 0.09068548 0.4358099
```

# 2 Multiple Correlation

```
df <- nas1982
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = df)
std_mvn <- BetaN(object)
std_adf <- BetaADF(object)
std_hc3 <- BetaHC(object, type = "hc3")
mvn <- RSqBetaSandwich(std_mvn)
adf <- RSqBetaSandwich(std_adf)
hc3 <- RSqBetaSandwich(std_hc3)</pre>
```

```
summary(mvn)
#> Call:
#> RSqBetaSandwich(object = std_mvn)
#> Multiple correlation with MVN standard errors:
#> est se t df p 0.05% 0.5% 2.5% 97.5% 99.5%
#> rsq 0.8045 4.1345 0.1946 42 0.8467 -13.8224 -10.3507 -7.5393 9.1483 11.9598
#> adj 0.7906 4.4299 0.1785 42 0.8592 -14.8811 -11.1615 -8.1492 9.7304 12.7426
#> 99.95%
#> rsq 15.4314
#> adj 16.4622
summary(adf)
#> Call:
#> RSqBetaSandwich(object = std_adf)
#> Multiple correlation with MVN standard errors:
#> est se t df p 0.05% 0.5% 2.5% 97.5% 99.5%
#> rsq 0.8045 3.6172 0.2224 42 0.8251 -11.9923 -8.9550 -6.4953 8.1044 10.5640
#> adj 0.7906 3.8756 0.2040 42 0.8394 -12.9203 -9.6661 -7.0307 8.6118 11.2472
#> 99.95%
#> rsq 13.6014
#> adj 14.5015
summary(hc3)
#> Call:
#> RSqBetaSandwich(object = std_hc3)
#> Multiple correlation with HC3 standard errors:
#> est se t df p 0.05% 0.5% 2.5% 97.5%
#> rsq 0.8045 3.9483 0.2038 42 0.8395 -13.1636 -9.8483 -7.1635 8.7725 11.4573
#> adj 0.7906 4.2303 0.1869 42 0.8527 -14.1753 -10.6231 -7.7466 9.3277 12.2043
#> 99.95%
#> rsq 14.7726
#> adj 15.7564
coef(mvn)
#> rsq.rsq adj.adj
#> 0.8045263 0.7905638
coef(adf)
#> rsq.rsq adj.adj
#> 0.8045263 0.7905638
```

```
coef(hc3)
#> rsq.rsq adj.adj
#> 0.8045263 0.7905638
vcov(mvn)
#> rsq adj
#> rsq 17.09432 18.31534
#> adj 18.31534 19.62358
vcov(adf)
#> rsq adj
#> rsq 13.08433 14.01893
#> adj 14.01893 15.02028
vcov(hc3)
#> rsq adj
#> rsq 15.58911 16.70262
#> adj 16.70262 17.89567
confint(mvn)
#> 2.5 % 97.5 %
#> rsq -7.539288 9.148341
#> adj -8.149238 9.730365
confint(adf)
#> 2.5 % 97.5 %
#> rsq -6.495334 8.104386
#> adj -7.030715 8.611842
confint(hc3)
#> 2.5 % 97.5 %
#> rsq -7.163476 8.772529
#> adj -7.746582 9.327709
```

## 3 Differences of Standardized Slopes

```
df <- nas1982
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = df)</pre>
```

```
std_mvn <- BetaN(object)</pre>
std_adf <- BetaADF(object)</pre>
std_hc3 <- BetaHC(object, type = "hc3")</pre>
mvn <- DiffBetaSandwich(std_mvn)</pre>
adf <- DiffBetaSandwich(std_adf)</pre>
hc3 <- DiffBetaSandwich(std_hc3)</pre>
summary(mvn)
#> Call:
#> DiffBetaSandwich(object = std_mvn)
#> Difference between standardized regression coefficients with MVN standard errors:
                    est se z p 0.05% 0.5%
                                                                2.5% 97.5%
#> NARTIC-PCTGRT 0.1037 0.1357 0.7640 0.4449 -0.3428 -0.2458 -0.1623 0.3696
#> NARTIC-PCTSUPP 0.2319 0.1252 1.8524 0.0640 -0.1800 -0.0906 -0.0135 0.4773
#> PCTGRT-PCTSUPP 0.1282 0.1227 1.0451 0.2960 -0.2755 -0.1878 -0.1123 0.3688
                  99.5% 99.95%
#> NARTIC-PCTGRT 0.4531 0.5501
#> NARTIC-PCTSUPP 0.5544 0.6438
#> PCTGRT-PCTSUPP 0.4443 0.5320
summary(adf)
#> Call:
#> DiffBetaSandwich(object = std_adf)
#> Difference between standardized regression coefficients with MVN standard errors:
                    est se z p 0.05% 0.5%
                                                                2.5% 97.5%
#> NARTIC-PCTGRT 0.1037 0.1212 0.8555 0.3923 -0.2950 -0.2084 -0.1338 0.3411
#> NARTIC-PCTSUPP 0.2319 0.1181 1.9642 0.0495 -0.1566 -0.0722 0.0005 0.4633
#> PCTGRT-PCTSUPP 0.1282 0.1215 1.0555 0.2912 -0.2716 -0.1847 -0.1099 0.3664
#>
                  99.5% 99.95%
#> NARTIC-PCTGRT 0.4158 0.5024
#> NARTIC-PCTSUPP 0.5360 0.6204
#> PCTGRT-PCTSUPP 0.4412 0.5281
summary(hc3)
#> Call:
#> DiffBetaSandwich(object = std_hc3)
#> Difference between standardized regression coefficients with HC3 standard errors:
                   est se z p 0.05% 0.5%
                                                                2.5% 97.5%
#> NARTIC-PCTGRT 0.1037 0.1417 0.7316 0.4644 -0.3626 -0.2613 -0.1741 0.3814
#> NARTIC-PCTSUPP 0.2319 0.1318 1.7595 0.0785 -0.2018 -0.1076 -0.0264 0.4902
#> PCTGRT-PCTSUPP 0.1282 0.1375 0.9329 0.3509 -0.3241 -0.2259 -0.1412 0.3977
                 99.5% 99.95%
```

```
#> NARTIC-PCTGRT 0.4686 0.5699
#> NARTIC-PCTSUPP 0.5714 0.6656
#> PCTGRT-PCTSUPP 0.4823 0.5806
coef(mvn)
#> NARTIC-PCTGRT NARTIC-PCTSUPP PCTGRT-PCTSUPP
#> 0.1036564 0.2318974 0.1282410
coef(adf)
#> NARTIC-PCTGRT NARTIC-PCTSUPP PCTGRT-PCTSUPP
#> 0.1036564 0.2318974 0.1282410
coef(hc3)
#> NARTIC-PCTGRT NARTIC-PCTSUPP PCTGRT-PCTSUPP
#> 0.1036564 0.2318974 0.1282410
vcov(mvn)
        NARTIC-PCTGRT NARTIC-PCTSUPP PCTGRT-PCTSUPP
#> NARTIC-PCTGRT 0.018408653 0.009511262 -0.008897391
#> NARTIC-PCTSUPP 0.009511262 0.015672035 0.006160773
#> PCTGRT-PCTSUPP -0.008897391 0.006160773 0.015058164
vcov(adf)
              NARTIC-PCTGRT NARTIC-PCTSUPP PCTGRT-PCTSUPP
#> NARTIC-PCTGRT 0.014681407 0.006928651 -0.007752755
#> NARTIC-PCTSUPP 0.006928651 0.013938955 0.007010303
#> PCTGRT-PCTSUPP -0.007752755 0.007010303 0.014763058
vcov(hc3)
              NARTIC-PCTGRT NARTIC-PCTSUPP PCTGRT-PCTSUPP
#> NARTIC-PCTGRT 0.020076382 0.009274583 -0.010801799
#> NARTIC-PCTSUPP 0.009274583 0.017370731 0.008096148
#> PCTGRT-PCTSUPP -0.010801799 0.008096148 0.018897947
confint(mvn)
                     2.5 % 97.5 %
#> NARTIC-PCTGRT -0.16226855 0.3695814
#> NARTIC-PCTSUPP -0.01346652 0.4772614
#> PCTGRT-PCTSUPP -0.11226950 0.3687516
confint(adf)
```

```
#> 2.5 % 97.5 %

#> NARTIC-PCTGRT -0.1338262589 0.3411391

#> NARTIC-PCTSUPP 0.0004975295 0.4632974

#> PCTGRT-PCTSUPP -0.1099011119 0.3663832

confint(hc3)

#> 2.5 % 97.5 %

#> NARTIC-PCTGRT -0.17405314 0.3813660

#> NARTIC-PCTSUPP -0.02642203 0.4902169

#> PCTGRT-PCTSUPP -0.14119483 0.3976769
```

### References

Pesigan, I. J. A., Sun, R. W., & Cheung, S. F. (2023). betaDelta and betaSandwich: Confidence intervals for standardized regression coefficients in R. *Multivariate Behavioral Research*, 58(6), 1183–1186. https://doi.org/10.1080/00273171.2023.2201277

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