Mediation Lab - Regression approach for causal mediation

12/07/2021

```
Statistical Methods for Causal Inference
   R Application
                                              ##
## Lung cancer example
                                              ##
## load in data
data_sens <- read.csv("sim_data_lung.csv")</pre>
### QUESTION 1C 2 AND 4#############
#install.packages("CMAverse")
library(CMAverse)
## run mediation analysis with interaction using cmest()
mediation.int.m1 <- cmest(data = data_sens, model = "rb", casecontrol = TRUE, yrare = TRUE,
                      outcome = "case",
                      exposure = "snp", mediator = "smoking", EMint = TRUE,
                      prec = c("sex", "colgrad", "age"),
                      mreg = list("logistic"), yreg = "logistic",
                      a = 1, astar = 0, mval = list(1),
                      estimation = "paramfunc", inference = "delta", full=FALSE)
mediation.int.m0 <- cmest(data = data_sens, model = "rb", casecontrol = TRUE, yrare = TRUE,
                      outcome = "case",
                      exposure = "snp", mediator = "smoking", EMint = TRUE,
                      prec = c("sex", "colgrad", "age"),
                     mreg = list("logistic"), yreg = "logistic",
                      a = 1, astar = 0, mval = list(0),
                      estimation = "paramfunc", inference = "delta", full=FALSE)
summary(mediation.int.m1)
## Causal Mediation Analysis
## # Outcome regression:
##
## Call:
## glm(formula = case ~ snp + smoking + snp * smoking, family = binomial(),
      data = getCall(x$reg.output$yreg)$data, weights = getCall(x$reg.output$yreg)$weights)
## Deviance Residuals:
```

```
Median
                1Q
                                  3Q
## -1.5152 -1.3239
                     0.8738
                              0.8738
                                        1.6529
##
## Coefficients:
              Estimate Std. Error z value Pr(>|z|)
## (Intercept) -1.07158
                          0.11586 -9.249
                                             <2e-16 ***
               0.07014
## snp
                          0.15581
                                    0.450
                                            0.6526
## smoking
                1.40955
                          0.13378 10.536
                                             <2e-16 ***
## snp:smoking 0.35804
                          0.17829
                                     2.008
                                            0.0446 *
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 4547.5 on 3299 degrees of freedom
## Residual deviance: 4138.8 on 3296 degrees of freedom
## AIC: 4146.8
##
## Number of Fisher Scoring iterations: 4
##
## # Mediator regressions:
##
## Call:
## glm(formula = smoking ~ snp, family = binomial(), data = getCall(x$reg.output$mreg[[1L]])$data,
       weights = getCall(x$reg.output$mreg[[1L]])$weights)
##
## Deviance Residuals:
     Min
              1Q Median
                               3Q
                                     Max
## -1.325 -1.295
                   1.037
                           1.065
                                    1.065
##
## Coefficients:
              Estimate Std. Error z value Pr(>|z|)
                          0.07769
## (Intercept) 0.27128
                                     3.492 0.00048 ***
               0.06893
                          0.10500
                                    0.656 0.51152
## snp
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 2044.0 on 1499 degrees of freedom
## Residual deviance: 2043.6 on 1498 degrees of freedom
## AIC: 2047.6
##
## Number of Fisher Scoring iterations: 4
##
##
## # Effect decomposition on the risk ratio scale for a case control study via the regression-based app
## Closed-form parameter function estimation with
##
  delta method standard errors, confidence intervals and p-values
##
##
        Estimate Std.error 95% CIL 95% CIU
## Rcde
        1.53446 0.13300 1.29473 1.819 7.80e-07 ***
```

```
0.11365 1.25535
                                      1.703 1.03e-06 ***
## Rpnde 1.46196
                                       1.708 9.50e-07 ***
## Rtnde 1.46608
                    0.11443 1.25811
                                       1.078
## Rpnie 1.01890
                     0.02913 0.96338
                                                 0.512
                     0.03358 0.95802
                                       1.090
                                                 0.512
## Rtnie 1.02177
## Rte
          1.49379
                    0.12483 1.26811
                                       1.760 1.57e-06 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Rcde: controlled direct effect risk ratio; Rpnde: pure natural direct effect risk ratio; Rtnde: tot
##
## Relevant variable values:
## $a
## [1] 1
##
## $astar
## [1] 0
##
## $yval
## [1] "1"
##
## $mval
## $mval[[1]]
## [1] 1
ggcmest(mediation.int.m1) +
 ggplot2::theme(axis.text.x = ggplot2::element_text(angle = 30, vjust = 0.8))
   1.8 -
Point Estimate and 95% CI
   1.0
            Rcde
                          Rpnde
                                                                     Rtnie
                                                                                    Rie
                                               Effect
summary(mediation.int.m0)
## Causal Mediation Analysis
##
## # Outcome regression:
##
## Call:
## glm(formula = case ~ snp + smoking + snp * smoking, family = binomial(),
```

```
##
       data = getCall(x$reg.output$yreg)$data, weights = getCall(x$reg.output$yreg)$weights)
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                    Median
##
                                  3Q
                                          Max
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                    0.8738
                              0.8738
                                        1.6529
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## Coefficients:
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## (Intercept) -1.07158
                          0.11586 -9.249
                                             <2e-16 ***
               0.07014
                          0.15581
                                     0.450
                                            0.6526
## smoking
               1.40955
                          0.13378 10.536
                                            <2e-16 ***
                                     2.008
## snp:smoking 0.35804
                          0.17829
                                            0.0446 *
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##
## # Mediator regressions:
## Call:
## glm(formula = smoking ~ snp, family = binomial(), data = getCall(x$reg.output$mreg[[1L]])$data,
       weights = getCall(x$reg.output$mreg[[1L]])$weights)
##
## Deviance Residuals:
     Min
              1Q Median
                               3Q
                                     Max
## -1.325 -1.295
                  1.037
                           1.065
                                    1.065
##
## Coefficients:
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## (Intercept) 0.27128
                          0.07769
                                    3.492 0.00048 ***
               0.06893
                          0.10500
                                    0.656 0.51152
## snp
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
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## # Effect decomposition on the risk ratio scale for a case control study via the regression-based app
## Closed-form parameter function estimation with
## delta method standard errors, confidence intervals and p-values
```

```
##
##
         Estimate Std.error 95% CIL 95% CIU
                                                 P.val
## Rcde
         1.07265
                    0.16713 0.79038
                                       1.456
                                                 0.653
## Rpnde 1.46196
                     0.11365 1.25535
                                      1.703 1.03e-06 ***
## Rtnde 1.46608
                    0.11443 1.25811
                                       1.708 9.50e-07 ***
## Rpnie 1.01890
                    0.02913 0.96338
                                      1.078
                                                 0.512
## Rtnie 1.02177
                     0.03358 0.95802
                                       1.090
                                                 0.512
                     0.12483 1.26811
                                       1.760 1.57e-06 ***
## Rte
          1.49379
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Rcde: controlled direct effect risk ratio; Rpnde: pure natural direct effect risk ratio; Rtnde: tot
## Relevant variable values:
## $a
## [1] 1
##
## $astar
## [1] 0
##
## $yval
## [1] "1"
##
## $mval
## $mval[[1]]
## [1] 0
ggcmest(mediation.int.m0) +
  ggplot2::theme(axis.text.x = ggplot2::element_text(angle = 30, vjust = 0.8))
  1.75 -
Point Estimate and 95% CI 1.50 1.00
   1.50 -
   1.25
  0.75 -
                                                Effect
## CDE(1) = 1.53
## CDE(0) = 1.07
## NIE = 1.02
## NDE = 1.45
```