Sensitivity Analysis

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0. Setup

Reading packages

```
library(readxl)
library(ggplot2)
library(data.table)
library(Hmisc)
## Loading required package: lattice
## Loading required package: survival
## Loading required package: Formula
## Attaching package: 'Hmisc'
## The following objects are masked from 'package:base':
##
##
       format.pval, units
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:Hmisc':
##
##
       src, summarize
## The following objects are masked from 'package:data.table':
##
##
       between, first, last
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
```

```
library(tidyr)
library(stringr)
library(binom)
library(gridExtra)
##
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
##
       combine
library(grid)
Creating file paths
if(Sys.info()["user"]=="JVARGH7"){
  path_ic_documentation <- "C:/code/support/interstitial_cystitis/documentation"</pre>
  path_ic_data <- "C:/Cloud/OneDrive - Emory University/Papers/Interstitial Cystitis/data"</pre>
 path_ic_save <- "C:/Cloud/OneDrive - Emory University/Papers/Interstitial Cystitis/working"</pre>
1. Data Cleaning
Reading the data into R
ic_sensitivity <- readxl::read_xlsx(paste0(path_ic_data,"/De-identified covariates data_20190102.xlsx")
colnames(ic_sensitivity) <- c("id","ic_list","cases",</pre>
                   "age_last_visit", "gender", "race", "smoking",
                   "elmiron", "hydroxyzine", "tca", "gabapentin", "hydroxychloroquine",
                   "cyclobenzaprine", "methenamine", "phenazopyridine", "oxybutynin")
ic_sensitivity <- ic_sensitivity %>% filter(!is.na(id))
ic_sensitivity <- ic_sensitivity %>% filter(!is.na(ic_list))
Labeling different columns
ic_sensitivity$cases <- as.factor(ic_sensitivity$cases)</pre>
levels(ic_sensitivity$cases) <- c("1 Definite","2 Possibly", "3 Not", "4 No images")</pre>
table(ic_sensitivity$cases,useNA = "always")
##
                                                             <NA>
##
    1 Definite 2 Possibly
                                  3 Not 4 No images
##
ic_sensitivity$gender <- as.factor(ic_sensitivity$gender)</pre>
levels(ic sensitivity$gender) <- c("1 Female", "2 Male")</pre>
table(ic_sensitivity$gender, useNA= "always")
```

```
##
## 1 Female 2 Male
                         <NA>
        148 17
##
ic_sensitivity$race <- as.factor(ic_sensitivity$race)</pre>
levels(ic_sensitivity$race) <- c("1 White","2 Black", "3 Other")</pre>
table(ic_sensitivity$race,useNA = "always")
##
## 1 White 2 Black 3 Other
                               <NA>
       115
              39 11
##
ic_sensitivity$smoking <- as.factor(ic_sensitivity$smoking)</pre>
levels(ic_sensitivity$smoking) <- c("1 Never", "2 Current", "3 Former")</pre>
table(ic_sensitivity$smoking,useNA = "always")
##
##
     1 Never 2 Current 3 Former
                                       <NA>
                        35
##
         118
                4
ic_sensitivity$elmiron <- with(ic_sensitivity,ifelse(!is.na(elmiron),1,0))</pre>
ic_sensitivity$hydroxyzine <- with(ic_sensitivity,ifelse(!is.na(hydroxyzine),1,0))</pre>
ic_sensitivity$tca <- with(ic_sensitivity,ifelse(!is.na(tca),1,0))</pre>
ic_sensitivity$gabapentin <- with(ic_sensitivity,ifelse(!is.na(gabapentin),1,0))</pre>
ic_sensitivity$hydroxychloroquine <- with(ic_sensitivity,ifelse(!is.na(hydroxychloroquine),1,0))</pre>
ic_sensitivity$cyclobenzaprine <- with(ic_sensitivity,ifelse(!is.na(cyclobenzaprine),1,0))</pre>
ic sensitivity methenamine <- with (ic sensitivity, if else (!is.na (methenamine), 1, 0))
ic_sensitivity phenazopyridine <- with (ic_sensitivity, if else (!is.na (phenazopyridine), 1,0))
ic_sensitivity\$oxybutynin <- with(ic_sensitivity,ifelse(!is.na(oxybutynin),1,0))
ic_sensitivity <- ic_sensitivity %>% mutate_at(c("elmiron","hydroxyzine",
                         "tca", "gabapentin", "hydroxychloroquine",
                          "cyclobenzaprine", "methenamine",
                          "phenazopyridine", "oxybutynin"),
                       funs(factor(.,labels=c("no","yes"))))
Generating Summary Statistics: The variable ID has been ignored.
describe(ic_sensitivity %>% select(-id,-ic_list))
## ic_sensitivity %>% select(-id, -ic_list)
##
##
  14 Variables
                       165 Observations
##
## cases
      n missing distinct
##
        165
                   Ω
##
## Value
               1 Definite 2 Possibly
                                             3 Not 4 No images
```

0.194

32 126

0.764

Frequency

Proportion

3

0.018

0.024

```
## age_last_visit
     n missing distinct Info Mean
                                 Gmd .05
                                              .10
##
     165 0 59
                    0.999 61.47 17.79
                                        36.0
                                              39.4
##
     . 25
           .50
                 .75
                      .90
                            .95
          64.0
##
    50.0
                73.0
                      80.0
                            85.6
## lowest : 24 25 28 29 31, highest: 86 87 88 89 90
## -----
## gender
 n missing distinct
##
    165
         0
##
## Value 1 Female 2 Male
## Frequency
          148
                 17
## Proportion 0.897
                 0.103
## n missing distinct
     165 0
##
##
## Value 1 White 2 Black 3 Other
## Frequency 115 39 11
## Proportion 0.697 0.236 0.067
## -----
## smoking
## n missing distinct
##
    157 8
##
## Value 1 Never 2 Current 3 Former
## Frequency 118 4
## Proportion 0.752 0.025
                        0.223
## elmiron
## n missing distinct
##
     165 0
##
## Value
          no
              yes
         125
## Frequency
## Proportion 0.758 0.242
## ------
## hydroxyzine
## n missing distinct
##
     165 0 2
##
## Value no yes
## Frequency 126 39
## Proportion 0.764 0.236
## tca
     n missing distinct
     165 0
##
##
## Value no yes
```

```
117 48
## Frequency
## Proportion 0.709 0.291
## ------
## gabapentin
   n missing distinct
##
    165 0
##
## Value
         no
             yes
## Frequency
        100
            65
## Proportion 0.606 0.394
## -----
## hydroxychloroquine
  n missing distinct
##
    165
       0
##
## Value
         no
            yes
        156
            9
## Frequency
## Proportion 0.945 0.055
## -----
## cyclobenzaprine
    n missing distinct
##
##
    165 0
##
## Value
         no
             yes
        124
            41
## Frequency
## Proportion 0.752 0.248
## -----
## methenamine
    n missing distinct
##
       0
    165
##
## Value
             yes
         no
## Frequency
        131
             34
## Proportion 0.794 0.206
## -----
## phenazopyridine
## n missing distinct
##
    165
         0
##
## Value
             yes
         no
## Frequency 116
## Proportion 0.703 0.297
## -----
## oxybutynin
     n missing distinct
       0
##
    165
##
## Value
         no
## Frequency
        140
## Proportion 0.848 0.152
```

2. 1,2 vs 3,4

A. Hypothesis Tests

```
ic_sensitivity$outcome <- with(ic_sensitivity, as.factor(ifelse(cases %in% c("1 Definite", "2 Possibly"
table(ic_sensitivity$outcome,useNA="always")
##
##
   no yes <NA>
  158
      7 0
Summary for Cases (Outcome = Yes)
describe(ic_sensitivity %>% filter(outcome=="yes") %>% select(-id,-ic_list))
## ic_sensitivity %>% filter(outcome == "yes") %>% select(-id, -ic_list)
##
## 15 Variables 7 Observations
## cases
##
      n missing distinct
##
      7 0
##
## Value 1 Definite 2 Possibly
            3 4
## Frequency
## Proportion
            0.429 0.571
## -----
## age_last_visit
##
     n missing distinct
                         Info Mean
                                         Gmd
##
       7 0 6
                         0.982
                                66.71
                                       12.57
##
         53
                         65
## Value
                61 63
                              75 87
## Frequency 1
                 1 2 1
## Proportion 0.143 0.143 0.286 0.143 0.143 0.143
## gender
  n missing distinct
##
      7
             0
## Value 1 Female 2 Male
            6
## Frequency
           0.857
## Proportion
                    0.143
## race
       n missing distinct
##
       7
         0
##
## Value 1 White 2 Black 3 Other
           5 1 1
## Frequency
## Proportion 0.714 0.143 0.143
## smoking
```

```
##
     n missing distinct
##
     7 0
##
## Value 1 Never 3 Former
## Frequency
         6
## Proportion 0.857 0.143
## -----
## elmiron
  n missing distinct
    7 0
##
##
## Value no yes
## Frequency 3 4
## Proportion 0.429 0.571
## ------
## hydroxyzine
##
     n missing distinct
     7 0 2
##
##
     no yes
## Value
## Frequency
         4
## Proportion 0.571 0.429
## -----
## tca
##
     n missing distinct
    7 0
##
## Value
     no yes
## Frequency
        5 2
## Proportion 0.714 0.286
## -----
## gabapentin
  n missing distinct
##
     7 0 2
##
## Value
            yes
      no
## Frequency
        4
## Proportion 0.571 0.429
## -----
## hydroxychloroquine
  n missing distinct value
##
        0
            1
## Value
       no
## Frequency 7
## Proportion 1
## -----
## cyclobenzaprine
    n missing distinct
##
     7 0
##
## Value
      no yes
## Frequency 5
## Proportion 0.714 0.286
```

```
## methenamine
   n missing distinct
##
      7 0 2
##
## Value
          no yes
## Frequency
          6 1
## Proportion 0.857 0.143
## -----
## phenazopyridine
   n missing distinct
##
          0
##
## Value no yes
## Frequency 4 3
## Proportion 0.571 0.429
## oxybutynin
##
   n missing distinct
      7 0
##
##
## Value
          no
             yes
         5
## Frequency
## Proportion 0.714 0.286
## ------
## outcome
##
   n missing distinct value
##
        0 1
                      yes
##
## Value
         yes
## Frequency
## Proportion 1
Summary for Non-cases (Outcome = No)
describe(ic_sensitivity %>% filter(outcome=="no") %>% select(-id,-ic_list))
## ic_sensitivity %>% filter(outcome == "no") %>% select(-id, -ic_list)
##
## 15 Variables 158 Observations
## cases
##
     n missing distinct
##
     158 0
##
            3 Not 4 No images
## Value
## Frequency
             32 126
## Proportion 0.203 0.797
## ------
## age_last_visit
  n missing distinct Info Mean
                                  Gmd
                                        .05
                                               .10
     158 0 58 0.999
                            61.23 17.99 35.7 39.0
##
```

```
.50 .75 .90 .95
##
    . 25
               73.0
##
    50.0
         64.0
                     80.0
                            84.3
##
## lowest : 24 25 28 29 31, highest: 86 87 88 89 90
## -----
## gender
## n missing distinct
##
          0
    158
##
## Value
      1 Female 2 Male
## Frequency
          142
## Proportion 0.899
               0.101
## -----
## race
     n missing distinct
     158 0 3
##
##
## Value 1 White 2 Black 3 Other
## Frequency
          110 38 10
## Proportion 0.696 0.241 0.063
## smoking
## n missing distinct
     150 8
##
## Value 1 Never 2 Current 3 Former
          112 4 34
## Frequency
## Proportion
         0.747 0.027 0.227
## elmiron
     n missing distinct
##
##
     158 0
##
## Value
          no yes
         122
## Frequency
## Proportion 0.772 0.228
## -----
## hydroxyzine
## n missing distinct
##
     158 0
##
## Value no yes
## Frequency 122 36
## Proportion 0.772 0.228
## -----
## tca
##
     n missing distinct
##
     158 0 2
##
## Value
          no
              yes
## Frequency
         112
## Proportion 0.709 0.291
## gabapentin
```

```
##
     n missing distinct
##
    158
       0
##
## Value
        no
            yes
## Frequency
          96
## Proportion 0.608 0.392
## -----
## hydroxychloroquine
  n missing distinct
##
    158 0
##
## Value
         no
             yes
## Frequency 149
## Proportion 0.943 0.057
## -----
## cyclobenzaprine
##
     n missing distinct
    158 0 2
##
##
## Value
         no
            yes
## Frequency
        119
## Proportion 0.753 0.247
## -----
## methenamine
   n missing distinct
    158 0
##
## Value
         no
             yes
## Frequency 125
## Proportion 0.791 0.209
## -----
## phenazopyridine
##
   n missing distinct
##
    158 0
##
## Value
         no
             yes
## Frequency
        112
## Proportion 0.709 0.291
## -----
## oxybutynin
  n missing distinct
        0
##
    158
##
## Value
             yes
## Frequency 135 23
## Proportion 0.854 0.146
## -----
## outcome
    n missing distinct value
       0 1
##
    158
##
## Value
## Frequency 158
## Proportion 1
```

Fisher's Exact Tests

Odds ratio values given here are "hypothesized odds ratio"- different from sample odds ratio which we typically report. Sample odds ratio given in next section

```
ic_sensitivity %>% select(-id,-ic_list,-cases,-outcome,-age_last_visit) %>%
sapply(.,y= ic_sensitivity$outcome,function(x,y) fisher.test(y,x))
```

```
## $gender
  Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 0.5398
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
    0.03028728 13.42560678
## sample estimates:
## odds ratio
##
    1.475125
##
##
## $race
##
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 0.6152
## alternative hypothesis: two.sided
##
##
## $smoking
##
## Fisher's Exact Test for Count Data
## data: y and x
## p-value = 1
## alternative hypothesis: two.sided
##
##
## $elmiron
##
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 0.05965
\ensuremath{\mbox{\#\#}} alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.7198942 31.9082656
## sample estimates:
## odds ratio
```

```
4.466291
##
##
##
## $hydroxyzine
## Fisher's Exact Test for Count Data
## data: y and x
## p-value = 0.3576
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.3535386 15.6785414
## sample estimates:
## odds ratio
##
    2.524431
##
##
## $tca
##
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 1
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.08969406 6.21420804
## sample estimates:
## odds ratio
## 0.9740496
##
##
## $gabapentin
##
## Fisher's Exact Test for Count Data
## data: y and x
## p-value = 1
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.1643564 7.1123540
## sample estimates:
## odds ratio
   1.160219
##
## $hydroxychloroquine
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 1
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.00000 13.49227
```

```
## sample estimates:
## odds ratio
##
##
##
## $cyclobenzaprine
## Fisher's Exact Test for Count Data
## data: y and x
## p-value = 1
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.1118345 7.8159694
## sample estimates:
## odds ratio
##
    1.219004
##
##
## $methenamine
##
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 1
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
## 0.01333047 5.50256741
## sample estimates:
## odds ratio
## 0.6328718
##
##
## $phenazopyridine
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 0.4248
## alternative hypothesis: true odds ratio is not equal to 1
## 95 percent confidence interval:
   0.2563609 11.2140999
## sample estimates:
## odds ratio
    1.818694
##
##
## $oxybutynin
## Fisher's Exact Test for Count Data
##
## data: y and x
## p-value = 0.2868
## alternative hypothesis: true odds ratio is not equal to 1
```

```
## 95 percent confidence interval:
    0.2102611 15.3242932
## sample estimates:
## odds ratio
     2.332249
Levene's test for Equality of variance does not reject the null hypothesis (Variances are equal)
car::leveneTest(age_last_visit~outcome,data=ic_sensitivity)
## Levene's Test for Homogeneity of Variance (center = median)
          Df F value Pr(>F)
## group
           1 2.6374 0.1063
         163
##
We will use Independent Two-sample T-test (Pooled) We do not reject the null hypothesis that age at last
visit is different across the outcome group
t.test(age_last_visit~outcome,data=ic_sensitivity,var.equal=TRUE)
##
##
   Two Sample t-test
##
## data: age_last_visit by outcome
## t = -0.91062, df = 163, p-value = 0.3638
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -17.363404
                 6.403187
## sample estimates:
## mean in group no mean in group yes
##
            61.23418
                               66.71429
with(ic_sensitivity,table(outcome,elmiron))
##
          elmiron
## outcome no yes
##
       no 122 36
##
       yes
             3
Sample Odds ratio
ic_sensitivity %>% select(-id,-ic_list,-cases,-outcome,-age_last_visit) %>%
  sapply(.,y= ic_sensitivity$outcome,function(x,y) exp(coef(glm(y~x,family="binomial"))))
## $gender
## (Intercept)
                   x2 Male
## 0.04225352 1.47916667
##
## $race
```

x3 Other

x2 Black

(Intercept)

```
0.04545455 0.57894737 2.20000000
##
## $smoking
## (Intercept) x2 Current
                                x3 Former
## 5.357143e-02 4.387531e-07 5.490196e-01
##
## $elmiron
## (Intercept)
## 0.02459016 4.51851852
##
## $hydroxyzine
## (Intercept)
## 0.03278689 2.54166667
##
## $tca
## (Intercept)
                      xyes
## 0.04464286 0.97391304
##
## $gabapentin
## (Intercept)
                      xyes
## 0.04166667 1.16129032
## $hydroxychloroquine
## (Intercept)
                        xyes
## 4.697987e-02 1.840548e-07
## $cyclobenzaprine
## (Intercept)
                      xyes
## 0.04201681 1.22051282
##
## $methenamine
## (Intercept)
                      xyes
    0.0480000 0.6313131
##
##
## $phenazopyridine
## (Intercept)
                      xyes
## 0.03571429 1.82608696
##
## $oxybutynin
## (Intercept)
## 0.03703704 2.34782609
confint_glm <- function(x,y){</pre>
 mod <- glm(y~x,family="binomial")</pre>
 mod_df <- broom::tidy(mod)</pre>
 mod_df <- mod_df %>% mutate(lci = exp(estimate-1.96*std.error),
                              uci = exp(estimate+1.96*std.error)) %>%
   mutate(estimate = exp(estimate)) %>% select(term,estimate,lci,uci)
  print(mod_df)
}
ic_sensitivity %>% select(-id,-cases,-outcome,-ic_list) %>%
  sapply(.,y= ic_sensitivity$outcome,function(x,y) {confint_glm(x,y)})
```

```
## # A tibble: 2 x 4
## term estimate lci uci
             <dbl> <dbl> <dbl>
   <chr>
## 1 (Intercept) 0.00921 0.000249 0.341
              1.02 0.972 1.08
## # A tibble: 2 x 4
## term estimate lci
## <chr>
            <dbl> <dbl> <dbl>
## 1 (Intercept) 0.0423 0.0187 0.0956
## 2 x2 Male 1.48 0.167 13.1
## # A tibble: 3 x 4
## term
          estimate lci
               <dbl> <dbl> <dbl>
   <chr>
## 1 (Intercept) 0.0455 0.0186 0.111
             0.579 0.0655 5.11
2.20 0.234 20.7
## 2 x2 Black
## 3 x3 Other
## # A tibble: 3 x 4
## term
                 estimate
                           lci
    <chr>
                  <dbl> <dbl>
                                <dbl>
## 1 (Intercept) 0.0536 0.0236 0.122
## 2 x2 Current 0.000000439 0
                              Inf
## 3 x3 Former 0.549 0.0639 4.72
## # A tibble: 2 x 4
## term
              estimate
                        lci
##
    <chr>
              <dbl> <dbl>
                               <dbl>
## 1 (Intercept) 0.0246 0.00782 0.0773
## 2 xyes
          4.52 0.966 21.1
## # A tibble: 2 x 4
## term
         estimate lci
                               uci
               <dbl> <dbl>
## <chr>
                            <dbl>
## 1 (Intercept) 0.0328 0.0121 0.0888
## 2 xyes
              2.54 0.544 11.9
## # A tibble: 2 x 4
         estimate lci uci
## term
              <dbl> <dbl> <dbl>
   <chr>
## 1 (Intercept) 0.0446 0.0182 0.109
## 2 xyes
               0.974 0.182 5.20
## # A tibble: 2 x 4
## term estimate
                      lci uci
               <dbl> <dbl> <dbl> <
##
   <chr>
## 1 (Intercept) 0.0417 0.0153 0.113
              1.16 0.251 5.37
## 2 xyes
## # A tibble: 2 x 4
## term
                 estimate
                         lci
                                  uci
    <chr>
                  <dbl> <dbl>
## 1 (Intercept) 0.0470 0.0220
                              0.100
## 2 xyes
              0.000000184 0
                               Inf
## # A tibble: 2 x 4
   term
              estimate lci uci
##
                <dbl> <dbl> <dbl>
    <chr>
## 1 (Intercept) 0.0420 0.0172 0.103
## 2 xyes 1.22 0.228 6.54
## # A tibble: 2 x 4
## term
         estimate lci uci
```

```
<chr>
                  <dbl> <dbl> <dbl>
##
                  0.0480 0.0212 0.109
## 1 (Intercept)
## 2 xyes
                  0.631 0.0734 5.43
## # A tibble: 2 x 4
##
   term
                estimate
                            lci
                                   uci
##
     <chr>
                   <dbl> <dbl> <dbl>
## 1 (Intercept)
                  0.0357 0.0132 0.0968
                   1.83 0.393 8.48
## 2 xyes
## # A tibble: 2 x 4
##
    term
                            lci
                estimate
                                     uci
##
     <chr>
                   <dbl> <dbl>
                                   <dbl>
## 1 (Intercept)
                  0.0370 0.0152 0.0904
## 2 xyes
                  2.35
                         0.430 12.8
##
            age last visit gender
                                      race
                                                  smoking
                                                               elmiron
## term
            Character,2
                          Character, 2 Character, 3 Character, 2 Character, 2
## estimate Numeric,2
                           Numeric,2
                                      Numeric,3
                                                  Numeric,3
                                                              Numeric,2
                                      Numeric,3
## lci
           Numeric,2
                           Numeric,2
                                                  Numeric,3
                                                              Numeric,2
           Numeric,2
                           Numeric,2
                                      Numeric,3
                                                  Numeric,3
                                                              Numeric,2
## uci
##
           hydroxyzine tca
                                    gabapentin hydroxychloroquine
## term
            Character, 2 Character, 2 Character, 2 Character, 2
## estimate Numeric,2
                                   Numeric,2
                                               Numeric,2
                       Numeric,2
## lci
           Numeric,2
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           Numeric,2
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##
            cyclobenzaprine methenamine phenazopyridine oxybutynin
           Character, 2
                            Character, 2 Character, 2
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## term
## estimate Numeric,2
                            Numeric,2
                                       Numeric,2
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## lci
           Numeric,2
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## uci
           Numeric,2
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```