

task2

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```
data <- read.csv("final_data.csv", header = T)
data <- na.omit(data)
head(data)
```

```
##   X Country AQI.Value AQI.Category CO.AQI.Value CO.AQI.Category Ozone.AQI.Value
## 1 0      123      51          1          1          0              36
## 2 1       71      41          0          1          0              5
## 3 2      108      66          1          1          0             39
## 4 3        0      34          0          1          0             34
## 5 4        37      22          0          0          0             22
## 6 5      164      54          1          1          0             14
```

```
##   Ozone.AQI.Category NO2.AQI.Value NO2.AQI.Category PM2.5.AQI.Value
## 1                  2              0              0             51
## 2                  0              1              0             41
## 3                  2              2              1             66
## 4                  2              0              0             20
## 5                  1              0              0              6
## 6                  0             11              2             54
```

```
##   PM2.5.AQI.Category
```

```
## 1                  1
## 2                  0
## 3                  1
## 4                  0
## 5                  0
## 6                  1
```

```
# Without confounders
```

```
model_formula_with_2 = 'PM2.5.AQI.Value ~ Country+CO.AQI.Category+NO2.AQI.Value+I(NO2.AQI.Value^2)+NO2.AQI.Value'
```

```
# With confounders
```

```
model_lr = lm(model_formula_with_2, data=data)
summary(model_lr)
```

```
##
```

```
## Call:
```

```
## lm(formula = model_formula_with_2, data = data)
```

```
##
```

```
## Residuals:
```

```
##      Min       1Q   Median       3Q      Max
## -147.88  -24.82   -8.34    9.87   444.32
```

```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
```

```
## (Intercept)          32.8166875  1.1848904  27.696 < 2e-16 ***
## Country              -0.0799932  0.0067169 -11.909 < 2e-16 ***
## CO.AQI.Category      40.3845562  0.9452686  42.723 < 2e-16 ***
## NO2.AQI.Value        1.9800556  0.2110941   9.380 < 2e-16 ***
## I(NO2.AQI.Value^2)   0.0142559  0.0048085   2.965 0.00303 **
## NO2.AQI.Category     -2.2120017  0.7747038  -2.855 0.00430 **
## Ozone.AQI.Value       0.8304036  0.0653855  12.700 < 2e-16 ***
## I(Ozone.AQI.Value^2) -0.0018996  0.0003135  -6.060 1.38e-09 ***
## Ozone.AQI.Category    2.5944170  0.6402305   4.052 5.09e-05 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 46.45 on 23026 degrees of freedom
## Multiple R-squared:  0.2884, Adjusted R-squared:  0.2882
## F-statistic: 1167 on 8 and 23026 DF, p-value: < 2.2e-16
```

```
# Without confounders
```

```
model_formula_with = 'PM2.5.AQI.Value ~ Country+CO.AQI.Category+NO2.AQI.Value+NO2.AQI.Category+Ozone.AQI.Value'
```

```
# With confounders
```

```
model_formula_without = 'PM2.5.AQI.Value ~ CO.AQI.Category'
```

```
# Without confounders
```

```
model_without = lm(model_formula_without, data=data)
```

```
# With confounders
```

```
model_with = lm(model_formula_with, data=data)
```

```
# Without confounders
```

```
summary(model_without)
```

```
##
## Call:
## lm(formula = model_formula_without, data = data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -95.81 -28.32  -9.32   9.68 444.68
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    55.3228     0.3720  148.72 <2e-16 ***
## CO.AQI.Category  57.4846     0.7659   75.05 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 49.35 on 23033 degrees of freedom
## Multiple R-squared:  0.1965, Adjusted R-squared:  0.1965
## F-statistic: 5633 on 1 and 23033 DF, p-value: < 2.2e-16
```

```
# With confounders
```

```
summary(model_with)
```

```
##
## Call:
## lm(formula = model_formula_with, data = data)
##
```

```

## Residuals:
##      Min       1Q   Median       3Q      Max
## -111.12  -24.74   -8.50    9.85   444.17
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    37.849653   0.821305  46.085 < 2e-16 ***
## Country        -0.077664   0.006688 -11.613 < 2e-16 ***
## CO.AQI.Category  39.874352   0.934067  42.689 < 2e-16 ***
## NO2.AQI.Value    2.473239   0.091386  27.064 < 2e-16 ***
## NO2.AQI.Category -3.754427   0.584406  -6.424 1.35e-10 ***
## Ozone.AQI.Value   0.448912   0.016388  27.393 < 2e-16 ***
## Ozone.AQI.Category 5.649331   0.403636  13.996 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 46.49 on 23028 degrees of freedom
## Multiple R-squared:  0.287, Adjusted R-squared:  0.2869
## F-statistic: 1545 on 6 and 23028 DF, p-value: < 2.2e-16
model_formula_without = 'PM2.5.AQI.Value ~ CO.AQI.Category+NO2.AQI.Value+NO2.AQI.Category+Ozone.AQI.Value'
# Without confounders
model_without = lm(model_formula_without, data=data)
summary(model_without)

##
## Call:
## lm(formula = model_formula_without, data = data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -98.86  -24.92   -8.53   10.17   441.87
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    32.01311   0.65145  49.141 < 2e-16 ***
## CO.AQI.Category  40.78226   0.93349  43.688 < 2e-16 ***
## NO2.AQI.Value    2.35456   0.09108  25.853 < 2e-16 ***
## NO2.AQI.Category -4.66858   0.58076  -8.039 9.51e-16 ***
## Ozone.AQI.Value   0.44529   0.01643  27.099 < 2e-16 ***
## Ozone.AQI.Category 5.04500   0.40143  12.568 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 46.63 on 23029 degrees of freedom
## Multiple R-squared:  0.2829, Adjusted R-squared:  0.2827
## F-statistic: 1817 on 5 and 23029 DF, p-value: < 2.2e-16
model_formula_without = 'PM2.5.AQI.Value ~ CO.AQI.Category+ NO2.AQI.Category+Ozone.AQI.Category'
# Without confounders
model_without = lm(model_formula_without, data=data)
summary(model_without)

##
## Call:

```

```
## lm(formula = model_formula_without, data = data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -102.29  -26.26   -8.89   11.74   440.43
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      36.9455     0.6516  56.696 < 2e-16 ***
## CO.AQI.Category    56.4135     0.8384  67.283 < 2e-16 ***
## NO2.AQI.Category    3.3179     0.4680   7.089 1.39e-12 ***
## Ozone.AQI.Category 11.3109     0.2962  38.190 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 47.85 on 23031 degrees of freedom
## Multiple R-squared:  0.2449, Adjusted R-squared:  0.2448
## F-statistic: 2490 on 3 and 23031 DF, p-value: < 2.2e-16
```

sen

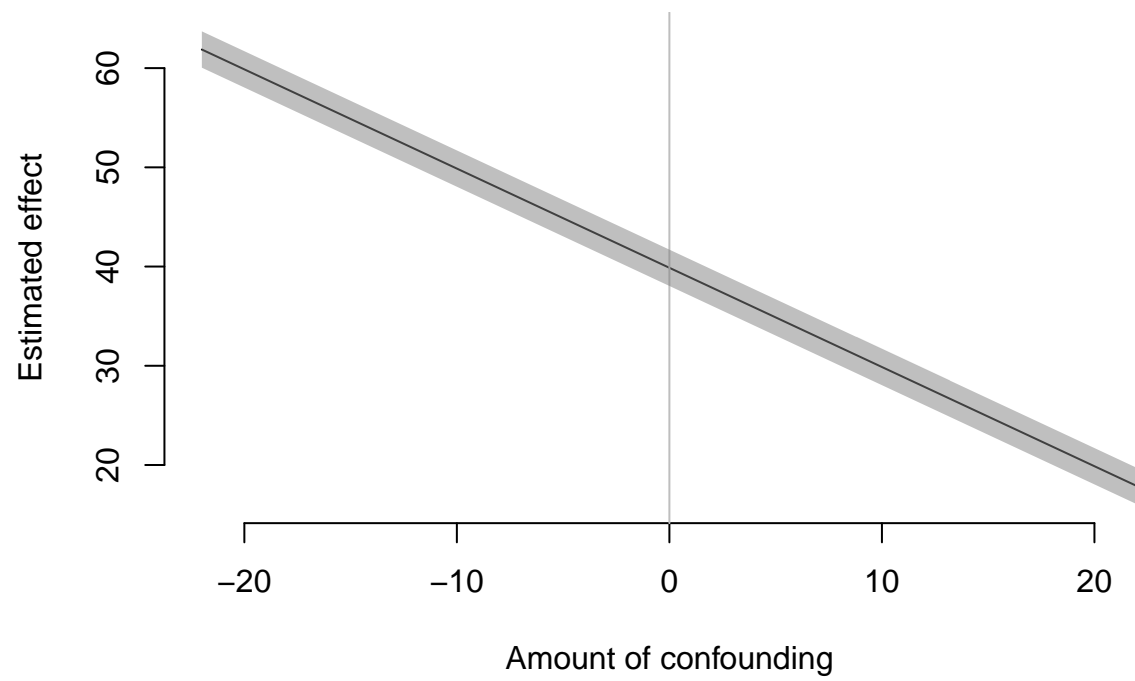
```
library(causalsens)                # Load MatchIt package
library(tidyverse)                 # For data manipulation

## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
## v dplyr      1.1.2      v readr      2.1.4
## v forcats    1.0.0      v stringr   1.5.0
## v ggplot2    3.4.2      v tibble    3.2.1
## v lubridate  1.9.2      v tidyr     1.3.0
## v purrr      1.0.1
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()    masks stats::lag()
## i Use the conflicted package (<http://conflicted.r-lib.org/>) to force all conflicts to become errors

model <- lm(model_formula_with, data = data)
p_model <- glm(CO.AQI.Category~NO2.AQI.Category+Ozone.AQI.Category+Country, data=data)

alpha <- seq(-4500, 4500, by = 250)
ll.sens <- causalsens(model, p_model, ~ NO2.AQI.Category+Ozone.AQI.Category, data = data,
  confound = one.sided.att)

plot(ll.sens, type = "raw", bty = "n")
```



```
plot(l1.sens, type = "r.squared", bty = "n")
```

