Lab4

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Question 1

Making the dataset

```
library(tidyverse)
instruction <- c(rep("lecture", 5), rep("lab", 5), rep("discussion", 5))
scores <- c(5, 6, 7, 8, 9, 8, 8, 9, 10, 10, 4, 4, 5, 5, 6)
dat <- data.frame(instruction, scores) %>% mutate(instruction.numeric = as.numeric(instruction))
```

Analysis

```
t.test(dat$scores[1:10]~dat$instruction[1:10])
```

```
##
## Welch Two Sample t-test
##
## data: dat$scores[1:10] by dat$instruction[1:10]
## t = 2.3905, df = 6.7586, p-value = 0.04938
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.007199513 3.992800487
## sample estimates:
## mean in group lab mean in group lecture
## 9 7
```

```
aov.mod <- aov(scores~instruction,dat)
summary(aov.mod)</pre>
```

```
## Df Sum Sq Mean Sq F value Pr(>F)
## instruction 2 44.13 22.07 15.76 0.000439 ***
## Residuals 12 16.80 1.40
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

effect sizes

```
library(lsr)
library(psych)
cohensD(dat$scores[1:10] ~ droplevels(dat$instruction[1:10]))
```

```
## [1] 1.511858

etaSquared(aov.mod)
```

```
## eta.sq eta.sq.part
## instruction 0.7242888 0.7242888
```

tapply(dat\$scores, dat\$instruction, describe)

```
## $discussion
     vars n mean sd median trimmed mad min max range skew kurtosis
       1 5 4.8 0.84
                          5
                                4.8 1.48
## X1
                                              6
                                                    2 0.25
##
## $lab
     vars n mean sd median trimmed mad min max range skew kurtosis
                                9 1.48
##
## $lecture
     vars n mean sd median trimmed mad min max range skew kurtosis
                                              9
                                                    4
## X1
        1 5
               7 1.58
                          7
                                  7 1.48
                                           5
                                                              -1.91 0.71
```

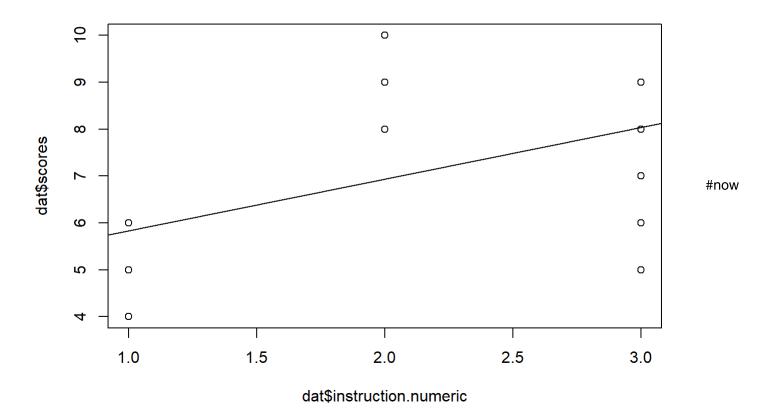
doing regressiosn the wrong ways utilizing as.numeric

```
wrong <- lm(scores ~ instruction.numeric, dat)
summary(wrong)</pre>
```

```
##
## Call:
## lm(formula = scores ~ instruction.numeric, data = dat)
##
## Residuals:
       Min
                 1Q
                     Median
                                   3Q
## -3.03333 -1.43333 -0.03333 1.06667 3.06667
##
## Coefficients:
##
                      Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                        4.7333
                                   1.3240
                                            3.575 0.00339 **
## instruction.numeric 1.1000
                                   0.6129
                                            1.795 0.09597 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1.938 on 13 degrees of freedom
## Multiple R-squared: 0.1986, Adjusted R-squared: 0.1369
## F-statistic: 3.221 on 1 and 13 DF, p-value: 0.09597
```

anova(wrong)

```
plot(dat$instruction.numeric, dat$scores)
abline(wrong)
```



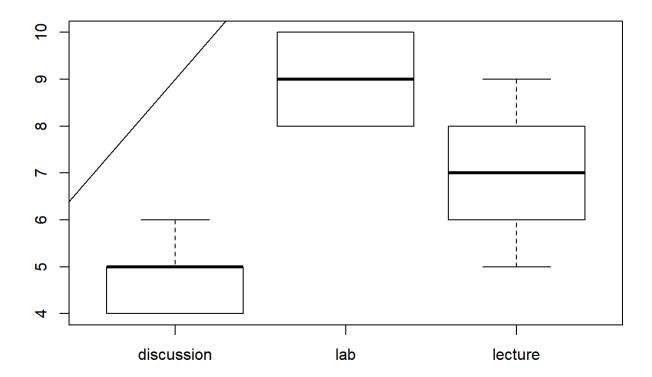
doing it the right way.

```
right <- lm(scores ~ instruction, dat)
summary(right)
```

```
##
## Call:
## lm(formula = scores ~ instruction, data = dat)
##
## Residuals:
##
     Min
            1Q Median 3Q
                                Max
   -2.0 -0.9 0.0
##
                         1.0
                                2.0
##
## Coefficients:
##
                    Estimate Std. Error t value Pr(>|t|)
                                0.5292 9.071 1.02e-06 ***
## (Intercept)
                      4.8000
## instructionlab
                      4.2000
                                 0.7483 5.612 0.000114 ***
## instructionlecture 2.2000
                                 0.7483 2.940 0.012375 *
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.183 on 12 degrees of freedom
## Multiple R-squared: 0.7243, Adjusted R-squared: 0.6783
## F-statistic: 15.76 on 2 and 12 DF, p-value: 0.0004393
```

anova(right)

```
plot(dat$instruction, dat$scores)
abline(right)
```



#loading some data

```
load("~/GitHub/Regression/hand4.RData")
library(Amelia)
library(Zelig)
library(mice)
```

Imputing data via Amelia

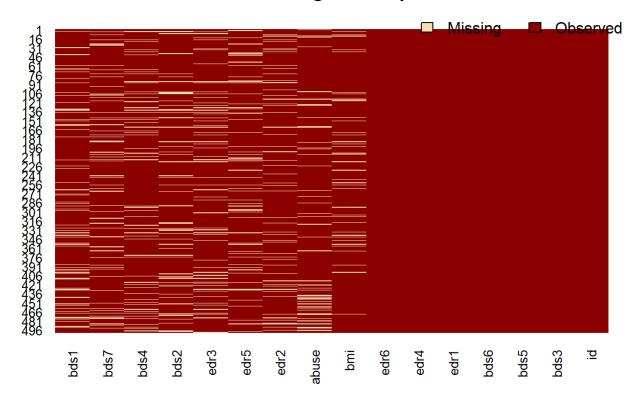
```
mi <- amelia(hand4, m = 20)
```

```
## -- Imputation 1 --
##
##
    1 2 3 4 5 6 7 8 9
##
## -- Imputation 2 --
##
##
    1 2 3 4 5 6 7 8 9
##
## -- Imputation 3 --
##
    1 2 3 4 5 6 7 8 9
##
##
## -- Imputation 4 --
##
##
    1 2 3 4 5 6 7 8
##
## -- Imputation 5 --
##
    1 2 3 4 5 6 7 8 9
##
##
## -- Imputation 6 --
##
##
    1 2 3 4 5 6 7 8 9
##
## -- Imputation 7 --
##
##
    1 2 3 4 5 6 7 8 9
##
## -- Imputation 8 --
##
##
    1 2 3 4 5 6 7 8 9
##
## -- Imputation 9 --
##
##
    1 2 3 4 5 6 7 8
##
## -- Imputation 10 --
##
    1 2 3 4 5 6 7 8
##
##
## -- Imputation 11 --
##
    1 2 3 4 5 6 7 8
##
##
## -- Imputation 12 --
##
##
    1 2 3 4 5 6 7 8 9 10
##
## -- Imputation 13 --
##
    1 2 3 4 5 6 7 8 9
##
##
## -- Imputation 14 --
```

```
##
##
   1 2 3 4 5 6 7 8
##
## -- Imputation 15 --
##
   1 2 3 4 5 6 7 8
##
##
## -- Imputation 16 --
##
##
   1 2 3 4 5 6 7 8 9
##
## -- Imputation 17 --
##
   1 2 3 4 5 6 7 8
##
##
## -- Imputation 18 --
##
##
  1 2 3 4 5 6 7 8 9
##
## -- Imputation 19 --
##
##
  1 2 3 4 5 6 7 8
##
## -- Imputation 20 --
##
## 1 2 3 4 5 6 7 8
```

missmap(mi)

Missingness Map



```
for(i in 1:20) {
    mi$imputations[[i]]$bds <- mi$imputations[[i]]$bds1 + mi$imputations[[i]]$bds2 + mi$imputations
    [[i]]$bds3 + mi$imputations[[i]]$bds4 + mi$imputations[[i]]$bds5 + mi$imputations[[i]]$bds6 + mi
$imputations[[i]]$bds7

mi$imputations[[i]]$edr <- mi$imputations[[i]]$edr1 + mi$imputations[[i]]$edr2 + mi$imputations
    [[i]]$edr3 + mi$imputations[[i]]$edr4 + mi$imputations[[i]]$edr5 + mi$imputations[[i]]$edr6
}
z.out <-zelig(edr~bds+abuse+bmi, model = "ls", data = mi)</pre>
```

```
## How to cite this model in Zelig:
## R Core Team. 2007.
## ls: Least Squares Regression for Continuous Dependent Variables
## in Christine Choirat, Christopher Gandrud, James Honaker, Kosuke Imai, Gary King, and Olivi
a Lau,
## "Zelig: Everyone's Statistical Software," http://zeligproject.org/
```

```
summary(z.out)
```

```
## Model: Combined Imputations
##
##
             Estimate Std.Error z value Pr(>|z|)
## (Intercept) 8.9049 1.3622
                                 6.54 6.3e-11
## bds
               0.4811
                      0.0342 14.07 < 2e-16
               1.8451
                                3.22 0.0013
## abuse
                         0.5726
## bmi
               0.0760
                        0.0634
                                  1.20 0.2307
##
## For results from individual imputed datasets, use summary(x, subset = i:j)
## Next step: Use 'setx' method
```

Imputing data via mice

```
imputed <- hand4 %>% mice(m = 20, maxit = 10, method = "pmm", seed = 69) %>%
  complete()
```

```
##
##
    iter imp variable
##
     1
          1
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
     1
          2
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
              abuse
          3
                                                               edr3
##
     1
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                                      edr5
          4
##
     1
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
                                                 bds7
##
     1
          5
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                        edr2
                                                               edr3
                                                                      edr5
##
     1
          6
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
          7
                                                 bds7
                                                        edr2
                                                               edr3
      1
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                                      edr5
                                                               edr3
##
      1
          8
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                                      edr5
              abuse
                      bmi
##
      1
          9
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
      1
          10
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
     1
          11
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
                                    bds2
                                           bds4
     1
          12
               abuse
                       bmi
                             bds1
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
     1
          13
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
     1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
          14
               abuse
                       bmi
                             bds1
     1
##
          15
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
     1
          16
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      1
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
          17
               abuse
                       bmi
      1
##
          18
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      1
          19
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
     1
               abuse
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
          20
                       bmi
##
      2
          1
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
      2
          2
##
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
     2
          3
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
              abuse
                      bmi
                                                                      edr5
     2
          4
                                                               edr3
##
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                                      edr5
      2
          5
                                                        edr2
                                                               edr3
##
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                                      edr5
##
      2
          6
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
              abuse
                      bmi
##
      2
          7
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
      2
##
          8
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
      2
          9
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
      2
##
          10
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      2
          11
               abuse
                       bmi
                             bds1
                                    bds2
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                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
     2
                                    bds2
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                                                  bds7
                                                                edr3
          12
               abuse
                       bmi
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                                                         edr2
                                                                       edr5
     2
                                    bds2
##
          13
                       bmi
                             bds1
                                           bds4
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                                                         edr2
                                                                edr3
                                                                       edr5
               abuse
      2
##
          14
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
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                                                         edr2
                                                                edr3
                                                                       edr5
      2
##
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
          15
               abuse
                       bmi
                             bds1
                                                                       edr5
##
      2
          16
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      2
          17
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      2
          18
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
      2
##
          19
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      2
          20
               abuse
                       bmi
                             bds1
                                    bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
##
      3
          1
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                              edr3
                                                                      edr5
              abuse
          2
                           bds1
##
      3
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
              abuse
                      bmi
      3
          3
                                                        edr2
                                                               edr3
##
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                                      edr5
              abuse
                      bmi
##
      3
          4
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
      3
          5
              abuse
                      bmi
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
##
      3
          6
                            bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
              abuse
                      bmi
##
     3
          7
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
              abuse
                      bmi
                           bds1
                                                                      edr5
              abuse
##
     3
          8
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
                                                 bds7
##
     3
          9
              abuse
                      bmi
                           bds1
                                   bds2
                                          bds4
                                                        edr2
                                                               edr3
                                                                      edr5
##
      3
          10
                       bmi
                             bds1
                                   bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
               abuse
                                                                       edr5
##
      3
                       bmi
                             bds1
                                   bds2
                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
          11
               abuse
                                                                       edr5
```

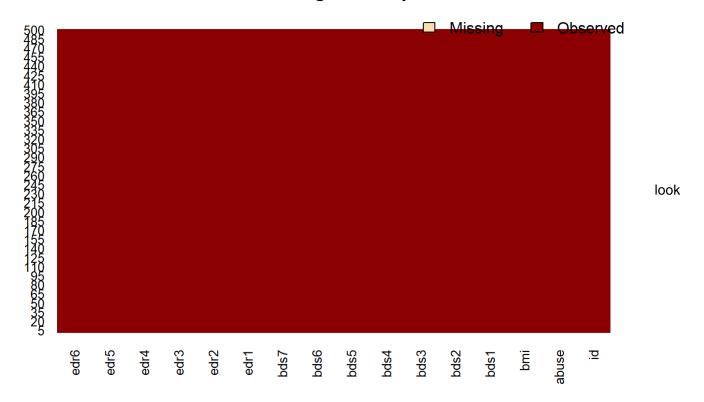
l	_		_								
##	3	12	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	13	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	14	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	15	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	16	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	17	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	18	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	19	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	3	20	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	1	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	2	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	3	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	4	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	5	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	6	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	7	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	8	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	9	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	10	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	11	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	12	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	13	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	14	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	15	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	16	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	17	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	18	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	19	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	4	20	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	1	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	2	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	3	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	4	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	5	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	6	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	7	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	8	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	9	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	10	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	11	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	12	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	13	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	14	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	15	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	16	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	17	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	18	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	5	19			bds1		bds4	bds7	edr2	edr3	
##	5	20	abuse abuse	bmi bmi	bds1	bds2 bds2	bds4	bds7	edr2	edr3	edr5 edr5
##	6					bds2		bds7			
	6	1	abuse	bmi	bds1		bds4		edr2	edr3	edr5
##		2	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	3	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	4	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	5	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5

	_	_	ahusa	hm:	hdc1	hdc2	hdc1	bdc7	o d n D	o d n D	odnE
##	6	6	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	7	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	8	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	9	abuse	bmi 	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	10	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	11	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	12	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	13	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	14	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	15	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	16	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	17	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	18	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	19	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	6	20	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	1	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	2	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	3	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	4	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	5	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	6	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	7	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	8	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	9	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	10	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	11	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	12	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	13	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	14	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	15	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	16	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	17	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	18	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	19	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	7	20	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	1	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	2	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	3	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	4	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	5	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	6	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	7	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	8	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	9	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	10	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	11	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	12	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	13	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	14	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	15	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8	16	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##											
	8	17	abuse	bmi	bds1	bds2	bds4	bds7	edr2	edr3	edr5
##	8 8	17 18	abuse abuse	bmi bmi	bds1 bds1	bds2 bds2	bds4 bds4	bds7 bds7	edr2 edr2	edr3 edr3	edr5 edr5

```
##
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                                                 bds7 edr2
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              abuse
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                                         bds4
                                                bds7
                                                       edr2
                                                              edr3
                                                                     edr5
             abuse
                           bds1
     9
          2
##
             abuse
                     bmi
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                                  bds2
                                         bds4
                                                bds7
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                                                              edr3
                                                                     edr5
     9
          3
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                                                              edr3
                                                                     edr5
##
             abuse
                      bmi
                           bds1
                                  bds2
                                         bds4
                                                bds7
##
     9
          4
             abuse
                     bmi
                           bds1
                                  bds2
                                         bds4
                                                bds7
                                                       edr2
                                                              edr3
                                                                     edr5
##
     9
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             abuse
                     bmi
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                                         bds4
                                                bds7
                                                       edr2
                                                              edr3
                                                                     edr5
     9
                                  bds2
                                         bds4
                                                bds7
                                                       edr2
                                                              edr3
                                                                     edr5
##
          6
             abuse
                     bmi
                           bds1
##
     9
          7
             abuse
                     bmi
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                                  bds2
                                         bds4
                                                bds7
                                                       edr2
                                                              edr3
                                                                     edr5
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                                  bds2
                                         bds4
                                                bds7
                                                       edr2
                                                              edr3
                                                                     edr5
             abuse
                     bmi
##
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                                                       edr2
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     9
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                       bmi
                                                                      edr5
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               abuse
                       bmi
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                                          bds4
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                                                                      edr5
##
     9
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                       bmi
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                                                                      edr5
##
          15
               abuse
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                                                                      edr5
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               abuse
                       bmi
     9
##
          18
               abuse
                       bmi
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                                                                      edr5
     9
##
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                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
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                                                        edr2
                                                               edr3
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           2
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                                                                      edr5
##
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               abuse
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                                                                      edr5
##
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                                          bds4
                                                 bds7
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                                                               edr3
                                                                      edr5
               abuse
                       bmi
##
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                                                                      edr5
               abuse
                       bmi
                                                        edr2
                                                               edr3
           7
##
     10
               abuse
                       bmi
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                                          bds4
                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
                                   bds2
                                          bds4
                                                        edr2
                                                               edr3
                                                                      edr5
##
     10
           8
               abuse
                       bmi
                            bds1
                                                 bds7
##
     10
           9
               abuse
                       bmi
                            bds1
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                                                 bds7
                                                        edr2
                                                               edr3
                                                                      edr5
                                                         edr2
##
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                                                                       edr5
##
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                                           bds4
                                                  bds7
                                                         edr2
                                                                edr3
                                                                       edr5
           11
##
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                                                   bds7
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                                                                edr3
                                                                       edr5
           12
                abuse
                        bmi
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                                    bds2
                                           bds4
                                                         edr2
                                                                edr3
##
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           13
                abuse
                        bmi
                                                   bds7
                                                                       edr5
##
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##
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##
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                abuse
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                                                                edr3
                                                                       edr5
##
     10
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                        bmi
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                                    bds2
                                           bds4
                                                   bds7
                                                         edr2
                                                                edr3
                                                                       edr5
```

missmap(imputed)

Missingness Map



at that, much better.

```
imputed <- imputed %>%
  mutate(bds = (bds1 + bds2 +bds3 +bds4 +bds5 +bds6 +bds7)/7,
        edr = (edr1 + edr2 + edr3 +edr4 +edr5 +edr6))
miss.out <- lm(edr~bds+abuse+bmi,imputed)
summary(miss.out)</pre>
```

```
##
## Call:
## lm(formula = edr ~ bds + abuse + bmi, data = imputed)
##
## Residuals:
                     Median
##
       Min
                 1Q
                                  3Q
                                          Max
## -10.6598 -2.3515 -0.1587
                              2.1311 11.7145
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 8.60137 1.32187
                                   6.507 1.88e-10 ***
                          0.22874 14.686 < 2e-16 ***
## bds
               3.35927
## abuse
               1.65941
                          0.49436
                                  3.357 0.000849 ***
## bmi
               0.08948
                          0.06082
                                  1.471 0.141863
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.485 on 496 degrees of freedom
## Multiple R-squared:
                        0.42, Adjusted R-squared: 0.4165
## F-statistic: 119.7 on 3 and 496 DF, p-value: < 2.2e-16
```

how about some power?

```
load("~/GitHub/Regression/lab3.RData")
cor.dat <- cor(lab3)
round(cor.dat,2)</pre>
```

```
##
           subjno timedrs phyheal menheal stress
## subjno
             1.00
                     0.02
                             0.00
                                    -0.07
                                          -0.06
                                     0.26
## timedrs
             0.02
                     1.00
                             0.44
                                            0.29
## phyheal
             0.00
                     0.44
                             1.00
                                     0.50
                                            0.31
## menheal -0.07
                     0.26
                             0.50
                                     1.00
                                            0.37
## stress
            -0.06
                     0.29
                                     0.37
                             0.31
                                            1.00
```

```
require(MASS)
```

```
## Loading required package: MASS
```

```
##
## Attaching package: 'MASS'
```

```
## The following object is masked from 'package:dplyr':
##
## select
```

```
pwr.MRC<-function(ry1=NULL, ry2=NULL, ry3=NULL, r12=NULL, r13=NULL, r23=NULL, n=NULL, alpha=.05,
 rep = 10000,
                        my=0, m1=0, m2=0, m3=0, sy=1, s1=1, s2=1, s3=1)
 {
pred<-NA
pred[is.null(r23)]<-2</pre>
pred[!is.null(r23)] < -3
  if (pred=="2")
    ry1, s1, r12,
                                                                     ry2, r12, s2),
                                                                   ncol = 3), empirical = TRUE)
    pop2 = data.frame(pop)
    values<-lm(X1~X2+X3, pop2)</pre>
    values<-summary(values)</pre>
    int<-(values$coefficients)[1,3]</pre>
    tb1<-(values$coefficients)[2,3] #grabs t from each analysis
    tb2<-(values$coefficients)[3,3]
    R2<-values$r.squared
    F<-values$fstatistic[1]
    df1<-values$fstatistic[2]
    df2<-values$fstatistic[3]
    f2<-R2/(1-R2)
    lambdaR2<-f2*df2
    minusalpha<-1-alpha
    FtR2<-qf(minusalpha, df1, df2)
    powerR2<-round(1-pf(FtR2, df1,df2,lambdaR2),3)</pre>
    lambdab1<-tb1^2
    lambdab2<-tb2^2
    Fb<-qf(minusalpha, 1, df2)
    powerb1<-round(1-pf(Fb, 1,df2,lambdab1),3)</pre>
    powerb2<-round(1-pf(Fb, 1,df2,lambdab2),3)</pre>
    {print(paste("Sample size is ",n))}
    {print(paste("Power R2 = ", powerR2))}
    {print(paste("Power b1 = ", powerb1))}
    {print(paste("Power b2 = ", powerb2))}
     }
  if (pred=="3")
  pop <- mvrnorm(n, mu = c(my, m1, m2, m3), Sigma = matrix(c(sy, ry1, ry2, ry3, ry1, s1, r12, r1))
3, ry2, r12,s2, r23, ry3, r13, r23, s3),
                 ncol = 4), empirical = TRUE)
  pop2 = data.frame(pop)
  values<-lm(X1\sim X2+X3+X4, pop2)
```

```
values<-summary(values)</pre>
  int<-(values$coefficients)[1,3]</pre>
  tb1<-(values$coefficients)[2,3] #grabs t from each analysis
  tb2<-(values$coefficients)[3,3]
  tb3<-(values$coefficients)[4,3]
  R2<-values$r.squared
  F<-values$fstatistic[1]</pre>
  df1<-values$fstatistic[2]</pre>
  df2<-values$fstatistic[3]
  f2<-R2/(1-R2)
  lambdaR2<-f2*df2
  minusalpha<-1-alpha
  FtR2<-qf(minusalpha, df1, df2)</pre>
  powerR2<-round(1-pf(FtR2, df1,df2,lambdaR2),3)</pre>
  lambdab1<-tb1^2
  lambdab2<-tb2^2
  lambdab3<-tb3^2
  Fb<-qf(minusalpha, 1, df2)
  powerb1<-round(1-pf(Fb, 1,df2,lambdab1),3)</pre>
  powerb2<-round(1-pf(Fb, 1,df2,lambdab2),3)</pre>
  powerb3<-round(1-pf(Fb, 1,df2,lambdab3),3)</pre>
  {print(paste("Sample size is ",n))}
  {print(paste("Power R2 = ", powerR2))}
  {print(paste("Power b1 = ", powerb1))}
  {print(paste("Power b2 = ", powerb2))}
  {print(paste("Power b3 = ", powerb3))}
   }}
##r2 ok
pwr.MRC(.44,.26,.29,.50,.31,.37,50)
```

```
## [1] "Sample size is 50"

## [1] "Power R2 = 0.837"

## [1] "Power b1 = 0.698"

## [1] "Power b2 = 0.05"

## [1] "Power b3 = 0.214"
```

```
##Stress
pwr.MRC(.44,.26,.29,.50,.31,.37,100)
```

```
## [1] "Sample size is 100"

## [1] "Power R2 = 0.995"

## [1] "Power b1 = 0.951"

## [1] "Power b2 = 0.05"

## [1] "Power b3 = 0.398"
```

```
##physical
pwr.MRC(.44,.26,.29,.50,.31,.37,300)
```

```
## [1] "Sample size is 300"

## [1] "Power R2 = 1"

## [1] "Power b1 = 1"

## [1] "Power b2 = 0.051"

## [1] "Power b3 = 0.852"
```