# My first assignment

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# **Load all libraries**

## Read in data

```
HF = read_csv("C:/Users/Ahmad Saquib
Sina/Desktop/HolzingerSwineford1939.csv")
## Parsed with column specification:
## cols(
##
     .default = col_double(),
##
     gender = col_character(),
     school = col_character()
## )
## See spec(...) for full column specifications.
head(HF)
## # A tibble: 6 x 32
        id gender grade agey agem school visual cubes paper flags general
     <dbl> <chr> <dbl> <dbl> <dbl> <dbl> <chr>
                                              <dbl> <dbl> <dbl> <dbl> <dbl>
                                                                          <dbl>
##
## 1
         1 Male
                            13
                                   1 Paste~
                                                 20
                                                       31
                                                              12
                                                                     3
                                                                             40
## 2
         2 Female
                       7
                            13
                                   7 Paste~
                                                 32
                                                       21
                                                              12
                                                                    17
                                                                             34
         3 Female
                       7
                            13
                                                 27
                                                              12
                                                                    15
                                                                             20
## 3
                                   1 Paste~
                                                       21
## 4
         4 Male
                            13
                                   2 Paste~
                                                 32
                                                       31
                                                              16
                                                                    24
                                                                             42
         5 Female
                       7
                                                                     7
                                                                             37
## 5
                            12
                                   2 Paste~
                                                 29
                                                       19
                                                              12
         6 Female
                                   1 Paste~
                                                       20
                                                                    18
## 6
                       7
                            14
                                                 32
                                                              11
                                                                             31
## # ... with 21 more variables: paragrap <dbl>, sentence <dbl>, wordc <dbl>,
       wordm <dbl>, addition <dbl>, code <dbl>, counting <dbl>,
## #
## #
       straight <dbl>, wordr <dbl>, numberr <dbl>, figurer <dbl>,
## #
       object <dbl>, numberf <dbl>, figurew <dbl>, deduct <dbl>,
## #
       numeric <dbl>, problemr <dbl>, series <dbl>, arithmet <dbl>,
       paperrev <dbl>, flagssub <dbl>
## #
```

### **Question one**

```
typeof(HF$gender)
## [1] "character"

typeof(HF$sentence)
## [1] "double"
```

OK

From the R, the variable type for gender is vector of characters as the storage type is character. On the other hand, the variable type for sentence is vector of decimals as the storage type is double. These variables are not the same type. The scale of measurement for the vector of characters is nominal which is not ordered. The scale of measurement for the vector of decimals is ratio. Not really. Ratio data means that ratios are meaningful, which isn't usually true for

psychological variables. 0 doesn't mean the person actually is illiterate, for instance -- it's more of a floor than a true zero point. A person who has the score 8 doesn't really have " twice as much" as someone who has the score 4. However, someone 6 feet tall is \*really\* twice as tall as 3, because zero has a concrete interpretation, unlike here

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 4.00 14.00 18.00 17.36 21.00 28.00
```

The minimum scores on the sentence test is 4 and maximum scores is 28.

## **Question three**

```
aggregate(sentence ~ school, data = HF, FUN = mean)
## school sentence
## 1 Grant-White 18.84828
## 2 Pasteur 15.98077
```

The mean on the sentence test at Grand white is 18.84828 and the mean on the sentence test at Pasteur is 15.98077.

# **Question four**

```
cor(HF$wordc, HF$sentence)
## [1] 0.6744079
```

The correlation between wordc and sentence test is 0.6744079

### **Quesiton five**

```
subset(HF, id == 90)
## # A tibble: 1 x 32
        id gender grade agey agem school visual cubes paper flags general
##
     <dbl> <chr> <dbl> <dbl> <dbl> <dbl> <chr>
##
                                             <dbl> <dbl> <dbl> <dbl> <dbl>
        90 Male
## 1
                            14
                                   5 Paste~
                                                29
                                                       33
                                                                   18
                                                                            18
## # ... with 21 more variables: paragrap <dbl>, sentence <dbl>, wordc <dbl>,
       wordm <dbl>, addition <dbl>, code <dbl>, counting <dbl>,
       straight <dbl>, wordr <dbl>, numberr <dbl>, figurer <dbl>,
## #
       object <dbl>, numberf <dbl>, figurew <dbl>, deduct <dbl>,
## #
       numeric <dbl>, problemr <dbl>, series <dbl>, arithmet <dbl>,
       paperrev <dbl>, flagssub <dbl>
```

THe school for id=90 is pasteur and their gender is Male.

#### **Question six**

```
table(HF$gender)
```

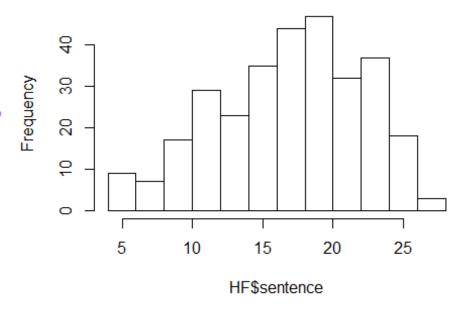
```
## ## Female Male ## 155 146 Part 1: 6.5/6.5
```

Female are 155 and Male are 146.

# **Question 7**

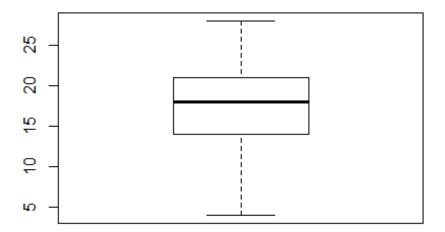
hist(HF\$sentence)

# Histogram of HF\$sentence



```
stem(HF$sentence)
##
     The decimal point is at the |
##
##
##
      4
          00
##
      5
          0
          000000
##
      6
      7
          000
##
##
      8
          0000
##
      9
          00000000
##
     10
          00000000
##
     11
          0000000000
     12
##
          000000000000000000
##
     13 |
          0000000000000
##
     14
          000000000
          0000000000000
##
     15
          00000000000000000000000
##
```

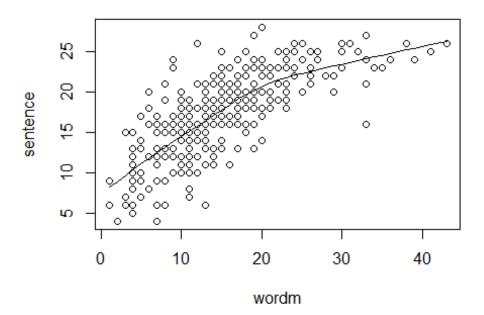
```
##
   17
       ##
   18
       000000000000000000000
   19
       ##
##
   20
       000000000000000000
##
   21
       000000000000000
##
   22
       00000000000000000
##
   23
       ##
   24
       00000000000
##
   25
       0000000000
       0000000
##
   26
   27
       00
##
##
   28 |
       0
boxplot(HF$sentence)
```



(a) From the histogram, it is visible that data in sentence are not normally discrtibuted. It is skewed to the left that is negative skewness. (b) It seems that there are no outliers from the stem and boxplot. (c) In my view, a transformation would be necessary to make it normal as data are not normally distributed. In my view, log transformation of data could be very helpful to make the skewed distribution into a more normal model.

But, we lose interpretability with a transformation, so it's always a tradeoff

```
Question 8
plot(sentence~wordm, data=HF)
lines(lowess(x = HF$wordm, y = HF$sentence))
```



The scatterplot shows that (a)the direction is postive, (b) the relationship is strong, all points are very close (c)the scatterplot is non-linear, the scatterplot is not linear as there is curvy in the middle and (d) there are outliers below and above the line and some outliers in the edge that are shown in the scatterplot.

-0.25 a bit vague -- which points are you considering outliers?

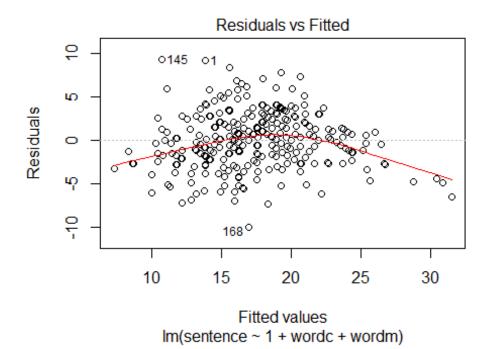
# Multiple regression

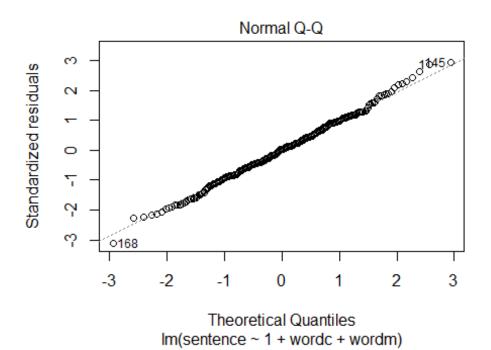
#### Part 2: 7.25/7.5

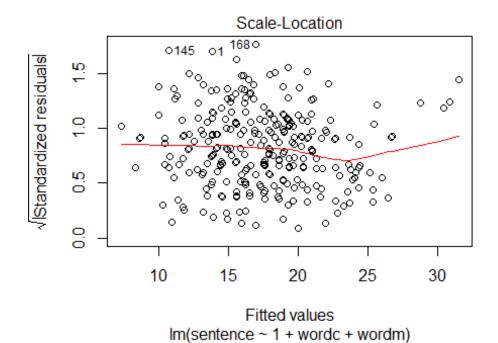
```
fit.lm=lm(sentence~1+wordc+wordm,data=HF)
fit.sem=sem(sentence~1+wordc+wordm,data=HF)

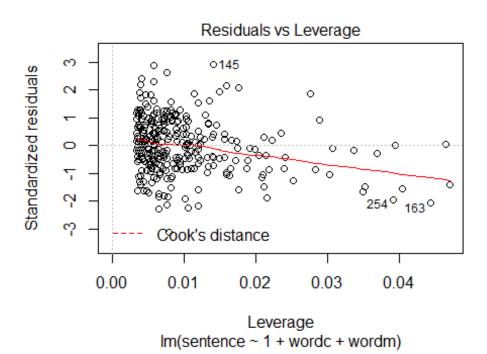
## Warning in lavaan::lavaan(model = sentence ~ 1 + wordc + wordm, data =
## HF, : lavaan WARNING: model seems to be a formula; please enclose the
model
## syntax between quotes
```

```
# View modeling assumptions
plot(fit.lm)
```

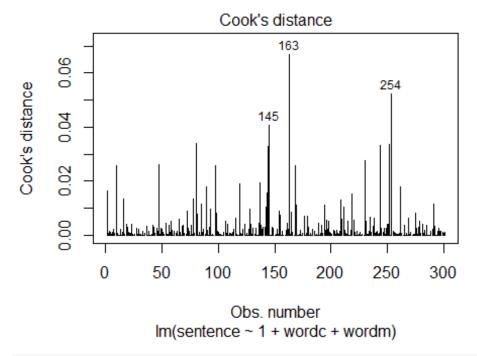




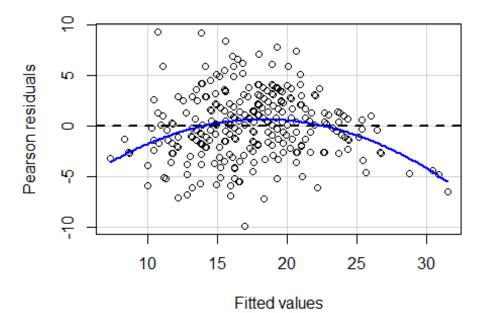




plot(fit.lm, which = 4) # Cook's distance



residualPlot(fit.lm)



a) From the residual plot, The homogeneity of variance for residuals is likely OK; the fanning is not severe; there is some fanning in the edge of the residual b) Yes, there are outliers that are present in residuals versus fitted plot and those points are 1, 145, and 168 c) From the cook's distance, we have found the influential points and they are 145, 164, and 254.d) The normality assumption is not likely violated; the upper end of the distribution is not deviated from what would be expected from a normal distribution in the QQ-plot. The normality seems roughly normal.

```
summary(fit.lm)
##
## Call:
## lm(formula = sentence ~ 1 + wordc + wordm, data = HF)
##
## Residuals:
##
      Min
                1Q Median
                                3Q
                                       Max
## -9.9390 -2.0554 0.0971 2.1153 9.2959
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
                                     3.481 0.000574 ***
## (Intercept) 3.08154
                           0.88526
## wordc
                0.35141
                           0.04008
                                     8.768 < 2e-16 ***
                           0.02966 11.239 < 2e-16 ***
## wordm
                0.33333
## ---
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
## Residual standard error: 3.205 on 298 degrees of freedom
## Multiple R-squared: 0.6171, Adjusted R-squared: 0.6146
## F-statistic: 240.2 on 2 and 298 DF, p-value: < 2.2e-16
summary(fit.sem)
## lavaan 0.6-3 ended normally after 15 iterations
##
##
     Optimization method
                                                    NLMINB
##
     Number of free parameters
                                                         4
##
##
     Number of observations
                                                       301
##
     Estimator
##
                                                        ML
##
    Model Fit Test Statistic
                                                     0.000
     Degrees of freedom
##
     Minimum Function Value
##
                                          0.0000000000000
##
## Parameter Estimates:
##
     Information
##
                                                  Expected
     Information saturated (h1) model
##
                                               Structured
     Standard Errors
                                                  Standard
##
```

```
##
## Regressions:
##
                       Estimate Std.Err z-value P(>|z|)
##
     sentence ~
                          0.351
                                   0.040
                                             8.812
                                                      0.000
##
       wordc
       wordm
                          0.333
                                            11.295
                                                      0.000
##
                                   0.030
##
## Intercepts:
                       Estimate Std.Err z-value
                                                    P(>|z|)
##
##
                          3.082
                                   0.881
                                             3.498
                                                      0.000
      .sentence
##
## Variances:
                       Estimate
                                                    P(>|z|)
##
                                 Std.Err
                                          z-value
##
      .sentence
                         10.168
                                   0.829
                                            12,268
                                                      0.000
```

(a) The unstandadized estimates from the regression model for wordc and wordm are 0.35 and 0.33.(b) Yes, they are statiscally significant because for both of them p value is less than 0.001 as we are assuming alpha vale is 0.05 (c) interpretation: The interpretations are: each one unit increase or difference in word classification test is associated with a 0.35 unit predicted increase or difference in sentence test after controlling for the difference of word meaning test. Also, each one unit difference or increase in word meaning test is associated with a 0.33 unit predicted increase or difference in sentence test after controlling for the difference of word classification test.

# **Question 11**

Some results are same using the sem and lm function, however, some are not same. For example, the values of estimates and standard errors are same for both function. From the lm function, t value is obtained. However, sem function gives z value. Also, residual standard error is 3.205 on 298 degrees of freedom for lm function. However, the degrees of freedom from sem function is 0 (zero). From lm function, we get multiple and adjusted R squared value. On the other hand, sem function does not give multiple and adjusted R squared value.

Part 3: 8.5/8.5

```
summary(fit.sem, standardized = TRUE)
## lavaan 0.6-3 ended normally after 15 iterations
##
##
     Optimization method
                                                     NLMINB
##
     Number of free parameters
                                                          4
##
##
     Number of observations
                                                        301
##
     Estimator
##
                                                         ML
##
     Model Fit Test Statistic
                                                      0.000
     Degrees of freedom
##
##
     Minimum Function Value
                                            0.0000000000000
```

```
##
## Parameter Estimates:
##
##
     Information
                                                   Expected
     Information saturated (h1) model
                                                 Structured
##
##
     Standard Errors
                                                   Standard
##
## Regressions:
                       Estimate Std.Err
                                          z-value
                                                    P(>|z|)
                                                              Std.lv Std.all
##
##
     sentence ~
##
                          0.351
                                   0.040
                                             8.812
                                                      0.000
                                                                         0.386
       wordc
                                                               0.351
##
       wordm
                          0.333
                                   0.030
                                            11.295
                                                      0.000
                                                               0.333
                                                                         0.495
##
## Intercepts:
##
                       Estimate
                                 Std.Err
                                          z-value
                                                    P(>|z|)
                                                              Std.lv
                                                                       Std.all
                          3.082
                                                                         0.598
##
      .sentence
                                   0.881
                                             3.498
                                                      0.000
                                                               3.082
##
## Variances:
                                                    P(>|z|)
##
                       Estimate Std.Err
                                          z-value
                                                              Std.lv
                                                                       Std.all
##
      .sentence
                         10.168
                                   0.829
                                           12.268
                                                      0.000
                                                              10.168
                                                                         0.383
```

The standardized estimates that is the beta weights for wordc and wordm are 0.386 and 0.495. interpretation: The interpretations are each one standard deviation increase or difference in word classification test is associated with a 0.386 standard deviation predicted increase or difference in sentence test after controlling for the difference of word meaning test. Also, each one standard deviation increase or difference in word meaning test is associated with a 0.495 standard deviation predicted increase or difference in sentence test after controlling for the difference of word classification test.

```
# Confidence intervals
confint(fit.lm)
##
                    2.5 %
                             97.5 %
## (Intercept) 1.3393857 4.8236986
## wordc
               0.2725404 0.4302791
## wordm
               0.2749611 0.3916922
summary(fit.sem, ci = TRUE)
## lavaan 0.6-3 ended normally after 15 iterations
##
##
     Optimization method
                                                     NLMINB
##
     Number of free parameters
                                                          4
##
##
     Number of observations
                                                        301
##
##
     Estimator
                                                         ML
     Model Fit Test Statistic
                                                      0.000
##
##
     Degrees of freedom
```

```
##
     Minimum Function Value
                                            0.0000000000000
##
## Parameter Estimates:
##
     Information
                                                    Expected
##
##
     Information saturated (h1) model
                                                 Structured
##
     Standard Errors
                                                    Standard
##
## Regressions:
##
                       Estimate Std.Err
                                           z-value
                                                     P(>|z|) ci.lower ci.upper
##
     sentence ~
       wordc
##
                          0.351
                                    0.040
                                             8.812
                                                       0.000
                                                                0.273
                                                                          0.430
##
       wordm
                          0.333
                                    0.030
                                            11.295
                                                       0.000
                                                                0.275
                                                                          0.391
##
## Intercepts:
                                Std.Err
                                                     P(>|z|) ci.lower ci.upper
##
                       Estimate
                                           z-value
##
      .sentence
                          3.082
                                    0.881
                                             3.498
                                                       0.000
                                                                1.355
                                                                          4.808
##
## Variances:
##
                       Estimate
                                  Std.Err
                                           z-value
                                                     P(>|z|) ci.lower ci.upper
                                            12.268
                                                       0.000
##
                         10.168
                                    0.829
                                                                8.543
                                                                         11.792
      .sentence
```

(a)From the regression model, The lower confidence interval for wordc and wordm are 0.273 and 0.275 respectively. The upper confidence interval for wordc and wordm are 0.430 and 0.392 respectively. The interpretations are that each one unit difference or increase in word classification test is associated with a difference or increase in sentence test between 0.273 and 0.430 units after controlling for the differences of word meaning test. Also, each one unit difference in word meaning test is associated with a difference or increses in sentence test between 0.275 and 0.392 units after controlling fro the differences of word classification test.b) we have found that p value is less than 0.05. If p value is less than 0.05, then confidence interval does not include the null hypothesis. Also, the null hypothesis is equal to zero. Here, we have found that confidence intervals for both word and wordm do not contain 0. Therefore, for both wordc and wordm, confidence intervals do not include null hypothesis so that the results are statistically significant.

```
# Obtain fit measures from lavaan
summary(fit.sem, fit.measures = TRUE)
## lavaan 0.6-3 ended normally after 15 iterations
##
##
     Optimization method
                                                     NLMINB
##
     Number of free parameters
                                                          4
##
##
     Number of observations
                                                        301
##
##
     Estimator
                                                         ML
##
     Model Fit Test Statistic
                                                      0.000
     Degrees of freedom
##
```

```
Minimum Function Value
                                           0.0000000000000
##
## Model test baseline model:
##
     Minimum Function Test Statistic
                                                   288.970
##
##
     Degrees of freedom
     P-value
##
                                                     0.000
##
## User model versus baseline model:
##
     Comparative Fit Index (CFI)
##
                                                     1.000
##
     Tucker-Lewis Index (TLI)
                                                     1.000
##
## Loglikelihood and Information Criteria:
##
     Loglikelihood user model (H0)
##
                                                  -776.147
##
     Loglikelihood unrestricted model (H1)
                                                  -776.147
##
##
     Number of free parameters
                                                          4
     Akaike (AIC)
##
                                                  1560.293
     Bayesian (BIC)
##
                                                  1575.121
     Sample-size adjusted Bayesian (BIC)
##
                                                  1562.436
## Root Mean Square Error of Approximation:
##
##
     RMSEA
                                                     0.000
     90 Percent Confidence Interval
                                              0.000
##
                                                     0.000
##
     P-value RMSEA <= 0.05
                                                        NA
## Standardized Root Mean Square Residual:
##
##
     SRMR
                                                     0.000
##
## Parameter Estimates:
##
     Information
##
                                                  Expected
##
     Information saturated (h1) model
                                                Structured
##
     Standard Errors
                                                  Standard
##
## Regressions:
                      Estimate Std.Err z-value P(>|z|)
##
##
     sentence ~
##
                                   0.040
                                            8.812
       wordc
                         0.351
                                                     0.000
                                           11.295
##
       wordm
                         0.333
                                   0.030
                                                     0.000
##
## Intercepts:
##
                      Estimate Std.Err z-value
                                                   P(>|z|)
##
                         3.082
                                   0.881
                                            3.498
                                                     0.000
      .sentence
##
## Variances:
```

```
## Estimate Std.Err z-value P(>|z|)
## .sentence 10.168 0.829 12.268 0.000
```

(a) The unusual about the fit measures for the fit.sem model is degrees of freddom is zero. For, model test basedline model the degrees of freedom is 2 which is very small. (b) The fit statistics for RMSEA, TLI, and CFI are 9,1,and 1 respectively.and (b) the degrees of freedom of this model is 0 however, for the model test basedline model the degress of freedom is 2. In Structural equation modeling, we specify that variables exist in the matrix (i.e., they have variances) and we make no other claims about them at all. No means, no regression paths, no intercepts, no correlations or covariances, no correlated residuals. Also, Number of observations available for model estimation and Number of observations used to estimate parameters might be equal therefore, the degrees of freedom is zero. However, for the model test baseline model there might some differences between them so that the degrees of freedom is 2.

? This isn't true, nor relevant

```
# Obtain the residuals and predicted values
resid(fit.lm)
```

```
##
                           2
                                         3
                                                                   5
                                                      4
                                                                                6
##
    9.18750259 -1.81249741
                             -1.29843961
                                            1.87229924 -1.86666658 -1.86674687
##
              7
                           8
                                        9
                                                     10
                                                                  11
                                                                               12
##
    3.00681158
                 2.13327320
                               6.90846555
                                            2.13333342
                                                        -0.47915070
                                                                     -0.90281281
##
             13
                          14
                                       15
                                                     16
                                                                  17
                                                                               18
   -3.30847206
                 0.46661992
                               2.43053391
                                            5.92644833
                                                         1.48468300 -3.05542837
##
##
             19
                          20
                                       21
                                                     22
                                                                  23
##
   -2.69596787
                -2.51525678
                             -1.44304461
                                           -1.40681809
                                                         3.80002685
                                                                     -1.14584413
##
             25
                          26
                                       27
                                                                  29
                                                                               30
                                                     28
                             -2.77637125
   -0.56954639
                -1.55146323
                                           -1.47917077 -3.12772083
                                                                     -0.74016480
##
             31
                          32
                                       33
                                                     34
                                                                  35
                                                                               36
                 0.25979505
                               2.00677143
   -1.49721378
                                            0.79996663
                                                         1.29594128
                                                                      4.50276615
##
##
             37
                          38
                                       39
                                                     40
                                                                  41
                                                                               42
                -3.51529693
                                            0.74579747
                                                                       3.57507869
##
   -0.53336001
                             -0.64175856
                                                        -1.62373562
             43
                          44
                                       45
                                                     46
                                                                  47
                                                                               48
##
    2.85413580
                               2.30395184
                                                        -5.98315598
##
                -2.14582406
                                            2.83609279
                                                                     -1.16390721
                                                     52
                                                                               54
##
             49
                          50
                                        51
                                                                  53
##
   -2.74020495
                 3.02485458
                             -1.44306469
                                            0.69148779
                                                        -2.68601571
                                                                       0.64741130
##
             55
                          56
                                        57
                                                     58
                                                                  59
                                                                               60
                             -1.75824796
                                            5.16947965
                                                        -2.05544844
   -1.32655521
                 4.20558574
                                                                       0.25979505
##
                                                     64
                                                                  65
                                                                               66
             61
                          62
                                       63
    3.43051383
                 2.07908397
                             -2.12778105
                                                         5.85417594
##
                                           -0.58756932
                                                                     -2.62369548
                                       69
##
             67
                          68
                                                     70
                                                                  71
                                                                               72
    0.09710690
               -5.20003337 -5.18197029 -1.49717363
                                                         0.96261464 -5.88480995
##
##
             73
                          74
                                       75
                                                     76
                                                                  77
                                                                               78
   -4.18197029
                 2.69154801
                             -0.18201043
                                           -3.79443433
                                                         1.44857691
                                                                     -3.96507283
##
             79
                          80
                                       81
                                                     82
                                                                  83
                                                                               84
##
   -2.14580398 -5.28029624 -5.77633111
                                                                       0.11516998
                                            0.41243068 -1.74022502
                                                                               90
##
             85
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                                                                  89
   -6.79443433 -1.39878746
                              2.83607272
                                            1.37626438 -7.14586420
                                                                      3.18752266
```

```
91 92 93 94 95 96
   0.07111355 2.48464285 -3.66787234 -0.47917077 1.43049376 -0.533333994
            98 99 100 101
##
       97
##
  6.57513891 7.74577740 -2.79441426 -2.23611938 -0.84866372 -1.21811652
       103 104 105 106
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   0.74573725 -0.88472966 -0.88462929 5.83613294 1.69156809 -3.77631104
##
                110 111
                                 112
                                           113
   0.44865721 1.25981512 -1.97510527 1.81802971 -2.90285296 2.69150787
##
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            116 117
                              118 119 120
  -4.81251749 1.39432746 0.09718719 -0.38879516 -6.93903933 -1.42490124
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##
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  1.07904382 -4.18195021 3.69158816 0.16943951 1.81808993 0.06096067
##
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                                           131
  3.13335350 4.90844547 4.00679150 -1.14586420 2.98874850 0.85421609
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##
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                                           137
 -2.38881523 -0.84862357 0.35820130 6.07910404 6.22372911 4.83613294
       139
                140
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                                 142
                                          143
## -2.67794493 3.78194370 3.34011815 -5.10971797 -4.67784457 -4.41675017
            146
                                 148
##
        145
                        147
                                          149
  9.29594128 0.78194370 0.02487466 -3.79441426 -2.34453800 0.44851669
            152
                     153 154
                                     155
       151
## -0.55130265 4.07908397 -1.58756932 -5.88480995 -5.90287303 0.72767417
               158 159 160
        157
                                          161
  2.85417594 0.04289759 0.09718719 3.46661992 4.07914419 4.07910404
                164
                         165
       163
                                 166
                                           167
## -6.50714586 1.06098074 2.95250190 3.09716712 -0.20003337 -9.93901926
       169
               170
                     171 172 173
## -7.29040898 -0.28031632 0.06108111 -1.07351152 3.72769424 0.16960009
            176
                         177 178
        175
                                           179
## -1.88472966 -2.67782450 0.76380033 -1.11969020 5.07914419 2.61118477
            182 183 184
       181
                                     185
## -0.60567254 2.11525027 0.44859699 -2.84866372 -2.95706227 1.11525027
                         189 190
                188
                                           191
  1.50278622 -0.62369548 -5.23613945 0.20554559 -1.29044913 4.02485458
                     195 196
       193
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                                     197
  2.41245075 -3.26229338 -1.71413131 -2.73207395 -2.65982164 3.48478336
                                 202
                        201
##
        199
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                                          203
## -2.18199036 1.39430738 1.81802971 2.76388062 -1.68595549 -1.32653514
               206 207 208
       205
                                          209
  4.11525027 1.67346486 1.53893245 3.09714704 -6.18201043 -3.36272152
##
        211
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                                          215
  7.35822137 3.76382040 2.41243068 1.02493487 4.13325313 0.48472314
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## -0.53333994 -4.73203381 -3.09153445 -0.90279274 0.67354515 -3.55144316
        235
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                                      239
## -5.58760947 2.41239053 3.06108111 7.07908397 2.02489473 2.06106103
```

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    3.76384048
                 0.97070549
                              1.26782568
                                            5.91637574 -2.67796501 -2.01127158
##
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##
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##
    2.85423616 -1.29034876
                              3.69154801
                                           5.48470307
                                                         3.67344479
                                                                     -4.85857573
##
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   -0.27222546 -6.16374662
                              1.41253105 -2.01127158
                                                         1.50282637
                                                                      0.61931577
##
##
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    1.44857691
                              1.24978268
                                           8.43045361
                                                        -1.34461829
##
                 1.39436760
                                                                      0.35826152
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                 0.32211529
##
   -2.58748903
                              0.97074564
                                           0.72773439 -3.39876738 -1.20003337
##
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##
    1.65536164 -0.29038891 -0.67796501
                                            1.39432746 -3.36274159 -4.53333994
##
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                                                                281
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##
    1.06100081
                 3.53895253 -5.49719370
                                            2.15137643
                                                         3.41237046
                                                                      1.30401206
##
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    3.18752266
                 0.34013822 -3.62375570
                                            0.44853677 -0.34451793
##
                                                                      0.46661992
##
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   -2.64175856
                 3.44853677
                              5.07902375
                                          -4.23619967
                                                         0.46663999
##
                                                                      0.41241061
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   -2.88478988 -3.64177863
                              2.09710690
                                           2.50274608 -1.32645485 -1.34463836
##
            301
## -1.11971027
resid(fit.sem)
## $type
## [1] "raw"
##
## $cov
##
             sentnc wordc wordm
## sentence 0
## wordc
                    0
## wordm
             0
                    0
                           0
##
## $mean
##
  sentence
                wordc
                          wordm
                    0
                              0
```

(a) No, the residuals values differ for these two types of models. From the lm, we get residuals for each individual data. However, from SEM, we get the residual covariance matrix (b) From residual (fit.sem), we get the residual covariance matrix. SEM is known as analysis of covariance structures. These residuals are actually residual covariance matrix from fit.sem

```
predict(fit.lm)
                                                                             7
##
                       2
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            1
## 13.812497 13.812497
                          8.298440 16.127701 17.866667 13.866747 20.993188
                       9
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                                                      12
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```

```
## 14.866727 16.091534 17.866667 14.479151 18.902813 19.308472 15.533380
        15
                       17 18 19
                                                      20
                 16
                                                                21
## 19.569466 11.073552 14.515317 13.055428 23.695968 17.515257 11.443045
                                   25
                           24
                  23
                                             26
                                                      27
## 14.406818 19.199973 13.145844 15.569546 15.551463 11.776371 13.479171
                  30
                          31
                                    32
                                             33
                                                      34
## 15.127721 13.740165 15.497214 11.740205 18.993229 16.200033 10.704059
                  37
                          38
                                   39
                                            40 41
## 14.497234 16.533360 15.515297 21.641759 20.254203 18.623736 13.424921
                                             47
        43
                  44
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                                                      48
                                    46
## 12.145864 14.145824 19.696048 14.163907 9.983156 14.163907 11.740205
                          52
                                                      55
         50
                  51
                                    53
                                             54
## 18.975145 10.443065 17.308512 8.686016 13.352589 19.326555 13.794414
        57
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                                                     62
## 13.758248 16.830520 12.055448 11.740205 18.569486 17.920916 12.127781
                  65
                          66 67
                                             68
                                                    69
## 18.587569 14.145824 20.623695 14.902893 16.200033 15.181970 17.497174
                 72
                          73
                                   74
                                             75
                                                     76
## 11.037385 14.884810 15.181970 20.308452 13.182010 12.794434 17.551423
         78
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                                                      83
  9.965073 15.145804 11.280296 13.776331 18.587569 10.740225 13.884830
        85
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## 12.794434 24.398787 13.163927 18.623736 12.145864 14.812477 10.928886
                  93
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                                            96
                                                      97
## 12.515357 11.667872 13.479171 17.569506 17.533340 16.424861 19.254223
        99
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                         101 102
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                                                    104
## 13.794414 20.236119 13.848664 16.218117 17.254263 18.884730 23.884629
        106
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                                   109
                                            110
                                                     111
## 16.163867 21.308432 14.776311 21.551343 12.740185 20.975105 15.181970
        113
                 114
                          115
                                   116
                                            117
                                                     118
## 16.902853 18.308492 12.812517 17.605673 18.902813 11.388795 15.939039
                          122
                                            124
                 121
                                  123
## 14.424901 15.920956 16.181950 22.308412 14.830560 18.181910 15.939039
                         129
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                 128
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                                                     132
## 18.866647 15.091555 19.993208 12.145864 22.011252 16.145784 10.388815
                 135
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                                                     139
## 15.848624 19.641799 18.920896 16.776271 16.163867 20.677945 19.218056
        141
                 142
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## 19.659882 11.109718 25.677845 30.416750 10.704059 19.218056 19.975125
                 149
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                                            152
                                                     153
## 13.794414 24.344538 14.551483 23.551303 17.920916 18.587569 14.884810
                 156
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                                                     160
## 15.902873 18.272326 14.145824 16.957102 18.902813 15.533380 20.920856
                          164
                                  165
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                 163
                                            166
                                                     167
## 18.920896 31.507146 16.939019 18.047498 17.902833 16.200033 16.939019
        169
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                                            173
                                                     174
## 18.290409 10.280316 21.938919 13.073512 19.272306 22.830400 18.884730
                                            180
        176
                 177
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                                   179
                                                     181
## 26.677824 16.236200 25.119690 20.920856 10.388815 17.605673 17.884750
  183 184 185 186 187 188 189
```

```
## 18.551403 13.848664 18.957062 17.884750 15.497214 20.623695 19.236139
                   191
                             192
                                       193
                                                 194
                                                           195
         190
## 11.794454 16.290449 18.975145 19.587549 7.262293 19.714131 26.732074
                                                 201
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                                                           202
## 22.659822 19.515217 14.181990 16.605693 15.181970 20.236119 11.685955
         204
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                                                           209
## 20.326535 17.884750 20.326535 14.461068 16.902853 13.182010 19.362722
                   212
                             213
                                      214
                                                 215
                                                           216
## 20.641779 17.236180 18.587569 22.975065 13.866747 16.515277 26.416830
##
         218
                   219
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                                       221
                                                 222
                                                           223
## 13.145844 21.065521 8.631766 13.866747 15.812457 18.957062 18.551403
                   226
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                                                           230
         225
                                                                     231
## 17.587589 17.272346 14.848644 17.884750 17.533340 28.732034 16.091534
        232
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                                                 236
                                                           237
## 19.902793 24.326455 16.551443 16.587609 16.587609 21.938919 17.920916
                   240
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## 20.975105 20.938939 18.236160 24.029295 21.732174 20.083624 19.677965
                   247
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## 21.011272 17.145764 21.290349 20.308452 15.515297 19.326555 30.858576
         253
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## 23.272225 22.163747 23.587469 21.011272 17.497174 25.380684 17.551423
         260
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                                                 264
                                                           265
## 19.605632 23.750217 15.569546 20.344618 22.641738 22.587489 23.677885
                   268
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                                                           272
## 26.029254 21.272266 25.398767 16.200033 19.344638 19.290389 19.677965
         274
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                                                                     280
## 17.605673 18.362742 17.533340 17.938999 15.461047 16.497194 15.848624
##
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                                                           286
## 15.587630 22.695988 14.812477 20.659862 17.623756 15.551463 25.344518
                   289
                             290
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                                                 292
                                                           293
## 15.533380 21.641759 15.551463 14.920976 16.236200 16.533360 17.587589
                   296
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## 15.884790 20.641779 14.902893 13.497254 24.326455 19.344638 24.119710
lavPredict(fit.sem)
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```

Yes, like the residuals, the predicted values are also differenct for these two types of mdoels. There is no predicted values for fit.sem model. When the lavPredict(fit.sem) runs, it does not give any predicted values because the main purpose of the lavPredict() function is to predict estimated values for the latent variables in the model ('factor scores'). It does not predict future values of dependent variables as in the regression framework. Therefore, it looks like this type.

... and it is blank because there are no latent variables