

R Notebook: Predictors of Dropout

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clear environment

```
rm(list = ls(all.names = TRUE))
```

Load library

```
#install.packages("lavaan")
#install.packages("xtable")
#install.packages("kableExtra")
#install.packages("semPlot")

library(tidyverse)
library(lavaan)
library(GGally)
library(xtable)
library("kableExtra")
library(knitr)
```

```
library(semPlot)
library(knitr)
library(gridExtra)
library(reshape)
library(pander)
```

Set Kim's Reliability Function

```
my_reliability <- function (items, itemal = TRUE, NA.Delete = TRUE)
{
  if (!all(apply(items, c(1, 2), is.numeric))) {
    items <- apply(items, c(1, 2), as.numeric)
    warning("Data is not numeric. Data has been coerced to be numeric.")
  }
  if (NA.Delete == FALSE) {
    items[is.na(items)] <- 0
    warning("Missing values or NA values are converted to zeros.")
  }
  items <- na.omit(items)
  s <- apply(items, 2, var)
  N <- ncol(items)
  X <- rowSums(items)
  alpha <- (N/(N - 1)) * (1 - sum(s)/var(X))
  if (itemal) {
    alphas <- array(dim = N)
    pbis <- array(dim = N)
    for (i in 1:N) {
      Xd <- rowSums(items[, -i])
      Mean <- sapply(items, mean)
      SD <- sapply(items, sd)
      Min <- sapply(items, min)
      Max <- sapply(items, max)
      Nobs <- sapply(items, length)
      alphas[i] <- ((N - 1)/(N - 2)) * (1 - sum(s[-i])/var(Xd))
      pbis[i] <- cor(items[, i], Xd)
      out <- list(nItem = N, nPerson = nrow(items), alpha = alpha,
        scaleMean = mean(X), scaleSD = sd(X), Alpha.If.Deleted = alphas,
        R.With.Total = pbis, Mean = Mean, SD = SD, Min = Min, Max = Max, Nobs=Nobs)
    }
  }
  else out <- list(nItem = N, nPerson = nrow(items), alpha = alpha,
    scaleMean = mean(X), scaleSD = sd(X))
  class(out) <- "my_reliability"
  out
}

print <- function(x, ...) {
  if (is.numeric(x)) base::print(round(x, digits=3), ...)
  else base::print(x, ...)
}
```

Load Data

```
setwd("T:/Research folders/CCWTG/Analyses/Papers/Dropout/lavaan")

att <- read_csv("R_pois.csv")
drop <- read_csv("R_log.csv")
```

Subset items

```
sem_items <- drop %>%
  select(risk_1:risk_32)

items <- c("risk_1", "risk_2", "risk_3", "risk_4", "risk_5", "risk_6", "risk_7", "risk_8", "risk_9", "risk_10", "risk_11", "risk_12", "risk_13", "risk_14", "risk_15", "risk_16", "risk_17", "risk_18", "risk_19", "risk_20", "risk_21", "risk_22", "risk_23", "risk_24", "risk_25", "risk_26", "risk_27", "risk_28", "risk_29", "risk_30", "risk_31", "risk_32")
```

Frequency table

```
#Count responses: plyr::count
count_all <- map(sem_items, plyr::count)

#Convert to dataframe
count_all <- as.data.frame(count_all)

#Get necessary info
count_all <- count_all %>%
  mutate(selection = ifelse(risk_1.x == 1, "yes", NA),
         selection = ifelse(risk_1.x == 0, "no", selection)) %>%
  select(selection, ends_with(".freq"))

count_all
```

	selection	risk_1.freq	risk_2.freq	risk_3.freq	risk_4.freq	risk_5.freq	risk_6.freq	risk_7.freq	risk_8.freq	risk_9.freq	risk_10.freq	risk_11.freq	risk_12.freq	risk_13.freq	risk_14.freq	risk_15.freq	risk_16.freq	risk_17.freq	risk_18.freq	risk_19.freq	risk_20.freq	risk_21.freq	risk_22.freq	risk_23.freq	risk_24.freq	risk_25.freq
## 1	no	405	435	329	420	373	355	327	440	424	358	387	289	393	422	333	376	407	284	310	235	213	254	306	435	348
## 2	yes	53	23	129	38	85	101	130	17	34	100	71	169	65	36	124	82	51	171	147	222	82	51	171	147	222
## 3	<NA>	36	36	36	36	36	38	37	37	36	36	36	36	36	36	37	36	36	39	37	37	36	36	39	37	37

```
## 3      36      37      36      36      37
## risk_26.freq risk_27.freq risk_28.freq risk_29.freq risk_30.freq
## 1      390      357      431      453      408
## 2       68      101       27       5       49
## 3       36       36       36       36       37
## risk_31.freq risk_32.freq
## 1      256      264
## 2      202      194
## 3       36       36
```

Item correlations

```
cor <- round(cor(sem_items, use = "pairwise.complete.obs"), 2)

upper<-cor
upper[upper.tri(cor)]<-" "
upper<-as.data.frame(upper)

kable(upper, "html", full_width = T)
```

```
risk_1
risk_2
risk_3
risk_4
risk_5
risk_6
risk_7
risk_8
risk_9
risk_10
risk_11
risk_12
risk_13
risk_14
risk_15
risk_16
risk_17
risk_18
risk_19
risk_20
risk_21
```

risk_22

risk_23

risk_24

risk_25

risk_26

risk_27

risk_28

risk_29

risk_30

risk_31

risk_32

risk_1

1

risk_2

0.2

1

risk_3

0.02

0.19

1

risk_4

0.06

0.11

0.11

1

risk_5

0.04

0.1

0.19

0.08

1

risk_6

0.26

0.05

0.2

0.14

0.43
1
risk_7
0.2
0.05
0.27
0.13
0.31
0.52
1
risk_8
0
0.22
-0.07
0.02
0
0.01
-0.02
1
risk_9
0.05
0.16
-0.01
0.07
0.01
0.01
0.04
0.52
1
risk_10
-0.11
0.07
0.07
0.05
-0.05
-0.08

0.04
0.2
0.23
1
risk_11
-0.08
0.12
0.04
0.05
0
0
0.04
0.2
0.2
0.52
1
risk_12
0.16
0.07
0.08
0.16
0.28
0.32
0.27
-0.08
-0.04
0.02
0.17
1
risk_13
0.07
0.19
0.11
-0.01
0.02
0.07

0.08
0.35
0.24
0.21
0.22
0.09
1
risk_14
0.02
0.04
0.03
0.03
0.03
0.02
0.05
0.11
0.07
0.18
0.17
0.21
0.14
1
risk_15
0.08
0.15
0.07
0.03
0.04
-0.01
0.1
0.11
0.03
0.19
0.16
0.08
0.1

0.17
1
risk_16
-0.01
0.1
0.14
0.07
0
0.07
0.11
0.15
0.06
0.1
0.16
0.09
0.2
0.16
0.13
1
risk_17
0.09
0.11
0.26
0.17
0.13
0.16
0.22
0
-0.02
0.03
0.1
0.13
0.23
0.03
0.08
0.11

1
risk_18
0.14
0.02
0.12
0.08
0.05
0.15
0.24
0.12
0.05
0.17
0.25
0.14
0.08
0.02
0.03
0.03
0.21
1
risk_19
-0.01
0.08
0.09
0.05
0.04
0
-0.07
0.11
0.11
0.08
0.05
0.02
0.11
-0.03
-0.01

0.02
0.02
-0.01
1
risk_20
-0.02
0.04
0.07
0.08
-0.07
-0.01
-0.15
-0.08
0.01
-0.01
0.04
-0.01
0.03
0.02
0.04
0.12
0.02
-0.06
0.17
1
risk_21
-0.07
-0.03
0.05
0.06
0.04
0.07
0
-0.03
-0.07
-0.01

0.04
-0.1
0.05
-0.02
-0.02
-0.02
-0.03
0.06
-0.03
0.14
1
risk_22
-0.08
0.02
0.09
0.05
-0.03
0
-0.09
-0.01
0.05
-0.01
0.01
0.02
0.01
-0.07
0.01
0.03
0.03
-0.06
0.18
0.28
0.16
1
risk_23
-0.04

0.07
0.12
0.12
0.02
0.06
0.1
-0.04
-0.02
-0.04
0.11
0.03
0.02
0
0
0.02
0.09
0.06
-0.05
0.09
0.29
0.13
1
risk_24
0.1
-0.05
-0.03
0
0.04
0.17
0.03
-0.05
0.01
-0.07
-0.04
-0.05
-0.04

0.12
-0.05
-0.03
0.01
0.07
0.06
0.02
-0.03
-0.06
0.01
1
risk_25
-0.12
-0.01
-0.01
0.13
0.06
-0.01
0.03
-0.03
0.04
0.19
0.16
-0.04
0.12
0.03
0.04
-0.05
0.05
-0.05
-0.08
-0.08
0.2
0.02
0.24
-0.01

1
risk_26
-0.02
0.02
0
0.16
-0.01
-0.02
-0.06
0.02
0
0.05
0.08
-0.04
0.04
0.06
-0.01
0
0.05
-0.02
0.05
0.13
0.16
0.11
0.16
0.13
0.27
1
risk_27
-0.06
0.09
0.05
0.16
0.02
0
0.01

0.03
0.03
0.09
0.11
0.01
0.1
0.04
0.08
0.01
0.13
0.02
0.04
0.03
0.11
0.08
0.17
0
0.39
0.39
1
risk_28
-0.03
0.03
0.03
0.09
-0.05
-0.04
0.07
0.1
0.11
0.11
0.15
-0.02
0.11
0.03
0.2

0.03
0.12
0.06
0.09
0.03
0.12
0.07
0.2
-0.02
0.32
0.18
0.27
1
risk_29
-0.04
-0.02
-0.07
0.12
-0.05
-0.06
-0.02
-0.02
-0.03
0.1
0.01
0.01
-0.04
0.05
0.03
-0.05
0.03
-0.08
0.06
-0.02
0.1
0.08

0.06
-0.02
0.14
0.13
0.15
0.15
1
risk_30
-0.04
0.15
0.05
0.16
-0.02
0
0.02
-0.03
0.09
0.04
0.07
-0.04
-0.02
-0.02
0.11
-0.05
0.08
-0.02
0.08
0.12
0.15
0.19
0.03
0.02
0.14
0.33
0.14
0.24

0.1
1
risk_31
-0.01
0.02
0.06
0
-0.08
-0.08
-0.06
-0.03
0.05
0.08
0.02
-0.04
0.04
-0.05
0.15
0.11
-0.01
-0.01
0.11
0.23
0.15
0.24
0.17
0.02
0.12
0.12
0.08
0.17
0.08
0.15
1
risk_32
-0.02

0.11
0.02
0.03
-0.03
-0.04
-0.15
0.07
0.08
0.06
0.05
-0.04
0.09
-0.05
0.04
0.03
-0.02
-0.05
0.15
0.24
0.07
0.38
0.07
-0.1
0.11
0.13
0.17
0.09
0.08
0.13
0.32
1

```
#kable(upper, "html") %>%  
# kable_styling(full_width = T, position = "left") # <- nicer chart but only works whenknit to html.
```

Confirmatory Factor Analyses

Models

```
eco_risk <- "eco_risk =~ risk_1 + risk_2 + risk_3 + risk_4 + risk_5 + risk_6 + risk_7"
fam_str <- "fam_str =~ risk_8 + risk_9 + risk_10 + risk_11 + risk_12 + risk_13 + risk_14 + risk_15 + risk_16 + risk_17 + risk_18"
peer_dif <- "peer_dif =~ risk_19 + risk_20"

aca_cha <- "aca_cha =~ risk_21 + risk_22 + risk_23"
prob_be <- "prob_be =~ risk_25 + risk_26 + risk_27 + risk_28 + risk_30 #+ risk_29"
men_he <- "men_he =~ risk_31 + risk_32"
```

Economic Risk

Item Analysis

```
items <- sem_items %>%
  select(risk_1 , risk_2 , risk_3 , risk_4 , risk_5 , risk_6 , risk_7)

variables <- c("risk_1","risk_2","risk_3","risk_4","risk_5","risk_6","risk_7")

ca <- my_reliability(items, itemal=TRUE, NA.Delete=TRUE)

pipealpha <- paste(formatC(round(ca$alpha, digits=2), 2, format = "f"))

temp <- cbind.data.frame(variables, ca$Nobs, ca$Mean, ca$SD, ca$Min, ca$Max, ca$R.With.Total, ca$Alpha.If.Deleted)
colnames(temp) <- c("Item", "N", "Average", "Standard Deviation", "Minimum", "Maximum", "Correlation with total", "Cronbach's Alpha if item is deleted")
rownames(temp) <- NULL

Cronbach's Alpha: 0.62

set.alignment('center', row.names = 'center')
pander(temp)
```

Table 1: Table continues below

Item	N	Average	Standard Deviation	Minimum	Maximum
risk_1	456	0.114	0.3182	0	1
risk_2	456	0.05044	0.2191	0	1
risk_3	456	0.2829	0.4509	0	1
risk_4	456	0.08333	0.2767	0	1
risk_5	456	0.1842	0.3881	0	1
risk_6	456	0.2215	0.4157	0	1
risk_7	456	0.2829	0.4509	0	1

Correlation with total	Cronbach's Alpha if item is deleted
0.2065	0.613
0.1921	0.6141
0.296	0.595

Correlation with total	Cronbach's Alpha if item is deleted
0.182	0.6171
0.3678	0.5641
0.542	0.4933
0.4952	0.5096

```
rm(ca)
rm(temp)
rm(pipealpha)
```

```
cfa <- cfa(eco_risk, data = sem_items)
summary(cfa, fit.measures = TRUE)
```

```
## lavaan (0.5-23.1097) converged normally after 56 iterations
##
##                               Used      Total
##   Number of observations          456      494
##
##   Estimator                      ML
##   Minimum Function Test Statistic    63.147
##   Degrees of freedom                 14
##   P-value (Chi-square)              0.000
##
## Model test baseline model:
##
##   Minimum Function Test Statistic    381.559
##   Degrees of freedom                 21
##   P-value                          0.000
##
## User model versus baseline model:
##
##   Comparative Fit Index (CFI)        0.864
##   Tucker-Lewis Index (TLI)         0.796
##
## Loglikelihood and Information Criteria:
##
##   Loglikelihood user model (H0)      -1007.856
##   Loglikelihood unrestricted model (H1) -976.282
##
##   Number of free parameters          14
##   Akaike (AIC)                      2043.712
##   Bayesian (BIC)                    2101.427
##   Sample-size adjusted Bayesian (BIC) 2056.995
##
## Root Mean Square Error of Approximation:
##
##   RMSEA                          0.088
##   90 Percent Confidence Interval    0.066 0.110
##   P-value RMSEA <= 0.05            0.002
##
## Standardized Root Mean Square Residual:
##
##   SRMR                          0.058
```

```
##
## Parameter Estimates:
##
## Information Expected
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## eco_risk =~
## risk_1 1.000
## risk_2 0.305 0.143 2.127 0.033
## risk_3 1.609 0.397 4.049 0.000
## risk_4 0.603 0.199 3.026 0.002
## risk_5 2.202 0.460 4.783 0.000
## risk_6 3.715 0.737 5.038 0.000
## risk_7 3.322 0.660 5.034 0.000
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_1 0.093 0.006 14.673 0.000
## .risk_2 0.047 0.003 15.023 0.000
## .risk_3 0.182 0.013 14.532 0.000
## .risk_4 0.074 0.005 14.906 0.000
## .risk_5 0.112 0.008 13.239 0.000
## .risk_6 0.063 0.011 5.934 0.000
## .risk_7 0.115 0.011 10.355 0.000
## eco_risk 0.008 0.003 2.641 0.008
```

```
rm(cfa)
```

Family structure

Item Analysis

```
items <- sem_items %>%
  select(risk_8 , risk_9 , risk_10 , risk_11 , risk_12 , risk_13 , risk_14 , risk_15 , risk_16 , risk_17)

variables <- c("risk_8","risk_9","risk_10","risk_11","risk_12","risk_13","risk_14","risk_15","risk_16","risk_17")

ca <- my_reliability(items, itemal=TRUE, NA.Delete=TRUE)

pipealpha <- paste(formatC(round(ca$alpha, digits=2), 2, format = "f"))

temp <- cbind.data.frame(variables, ca$Nobs, ca$Mean, ca$SD, ca$Min, ca$Max, ca$R.With.Total, ca$Alpha.1)
colnames(temp) <- c("Item", "N", "Average", "Standard Deviation", "Minimum", "Maximum", "Correlation with Total")
rownames(temp) <- NULL
```

Cronbach's Alpha: 0.59

Item	N	Average	Standard Deviation	Minimum	Maximum
------	---	---------	--------------------	---------	---------

Table 3: Table continues below

Item	N	Average	Standard Deviation	Minimum	Maximum
risk_8	453	0.03091	0.1733	0	1
risk_9	453	0.07064	0.2565	0	1
risk_10	453	0.2163	0.4122	0	1
risk_11	453	0.1523	0.3597	0	1
risk_12	453	0.3709	0.4836	0	1
risk_13	453	0.1369	0.3441	0	1
risk_14	453	0.07506	0.2638	0	1
risk_15	453	0.2671	0.4429	0	1
risk_16	453	0.1744	0.3799	0	1
risk_17	453	0.1126	0.3164	0	1
risk_18	453	0.3753	0.4847	0	1

Correlation with total	Cronbach's Alpha if item is deleted
0.2763	0.5753
0.1936	0.5813
0.3715	0.5391
0.472	0.5189
0.2081	0.5868
0.337	0.5515
0.2403	0.5738
0.1974	0.5862
0.2087	0.5798
0.2291	0.5746
0.2361	0.5786

```
cfa <- cfa(fam_str, data = sem_items)
summary(cfa, fit.measures = TRUE)
```

```
## lavaan (0.5-23.1097) converged normally after 93 iterations
##
##                               Used      Total
##   Number of observations          453        494
##
##   Estimator                      ML
##   Minimum Function Test Statistic    250.687
##   Degrees of freedom                 44
##   P-value (Chi-square)              0.000
##
## Model test baseline model:
##
##   Minimum Function Test Statistic    572.744
##   Degrees of freedom                 55
##   P-value                           0.000
##
## User model versus baseline model:
##
```



```

## Comparative Fit Index (CFI) 0.601
## Tucker-Lewis Index (TLI) 0.501
##
## Loglikelihood and Information Criteria:
##
## Loglikelihood user model (H0) -1556.172
## Loglikelihood unrestricted model (H1) -1430.828
##
## Number of free parameters 22
## Akaike (AIC) 3156.344
## Bayesian (BIC) 3246.893
## Sample-size adjusted Bayesian (BIC) 3177.073
##
## Root Mean Square Error of Approximation:
##
## RMSEA 0.102
## 90 Percent Confidence Interval 0.090 0.114
## P-value RMSEA <= 0.05 0.000
##
## Standardized Root Mean Square Residual:
##
## SRMR 0.080
##
## Parameter Estimates:
##
## Information Expected
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## fam_str =~
## risk_8 1.000
## risk_9 1.369 0.281 4.864 0.000
## risk_10 3.919 0.629 6.230 0.000
## risk_11 3.680 0.584 6.302 0.000
## risk_12 1.402 0.449 3.126 0.002
## risk_13 2.076 0.398 5.211 0.000
## risk_14 0.935 0.255 3.674 0.000
## risk_15 1.587 0.429 3.704 0.000
## risk_16 1.280 0.362 3.530 0.000
## risk_17 0.894 0.292 3.058 0.002
## risk_18 2.260 0.506 4.469 0.000
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_8 0.026 0.002 13.941 0.000
## .risk_9 0.057 0.004 14.128 0.000
## .risk_10 0.102 0.010 10.594 0.000
## .risk_11 0.070 0.007 9.386 0.000
## .risk_12 0.225 0.015 14.805 0.000
## .risk_13 0.099 0.007 13.816 0.000
## .risk_14 0.066 0.004 14.676 0.000
## .risk_15 0.185 0.013 14.667 0.000
## .risk_16 0.137 0.009 14.714 0.000

```

```
##      .risk_17      0.096    0.007   14.818    0.000
##      .risk_18      0.212    0.015   14.371    0.000
##      fam_str       0.004    0.001    3.513    0.000
```

```
rm(cfa)
```

Peer difficulties

Item Analysis

```
items <- sem_items %>%
  select(risk_19 , risk_20)

variables <- c("risk_19","risk_20")

ca <- my_reliability(items, itemal=TRUE, NA.Delete=TRUE)

pipealpha <- paste(formatC(round(ca$alpha, digits=2), 2, format = "f"))

temp <- cbind.data.frame(variables, ca$Nobs, ca$Mean, ca$SD, ca$Min, ca$Max, ca$R.With.Total)
colnames(temp) <- c("Item", "N", "Average", "Standard Deviation", "Minimum", "Maximum", "Correlation with total")
rownames(temp) <- NULL
```

Cronbach's Alpha NA (2-items scale)

Table 5: Table continues below

Item	N	Average	Standard Deviation	Minimum	Maximum
risk_19	456	0.3202	0.4671	0	1
risk_20	456	0.4868	0.5004	0	1

Correlation with total
0.1685
0.1685

```
cfa <- cfa(peer_dif, data = sem_items)
```

```
## Warning in lav_model_vcov(lavmodel = lavmodel, lavsamplestats = lavsamplestats, : lavaan WARNING: covariance matrix is not positive definite
## lavaan NOTE: this may be a symptom that the model is not identified.
```

```
summary(cfa, fit.measures = TRUE)
```

```
## lavaan (0.5-23.1097) converged normally after 12 iterations
```

```
##
##                               Used      Total
## Number of observations         456       494
##
## Estimator                      ML
## Minimum Function Test Statistic NA
## Degrees of freedom              -1
```

```

## Minimum Function Value 0.000000000000
##
## User model versus baseline model:
##
## Comparative Fit Index (CFI) NA
## Tucker-Lewis Index (TLI) NA
##
## Loglikelihood and Information Criteria:
##
## Loglikelihood user model (H0) -623.613
## Loglikelihood unrestricted model (H1) -623.613
##
## Number of free parameters 4
## Akaike (AIC) 1255.226
## Bayesian (BIC) 1271.716
## Sample-size adjusted Bayesian (BIC) 1259.022
##
## Root Mean Square Error of Approximation:
##
## RMSEA NA
## 90 Percent Confidence Interval NA NA
## P-value RMSEA <= 0.05 NA
##
## Standardized Root Mean Square Residual:
##
## SRMR 0.000
##
## Parameter Estimates:
##
## Information Expected
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## peer_dif =~
## risk_19 1.000
## risk_20 0.256 NA
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_19 0.064 NA
## .risk_20 0.240 NA
## peer_dif 0.154 NA
rm(cfa)

```

Academic Challenges

Item Analysis

```

items <- sem_items %>%
  select(risk_21 , risk_22 , risk_23, risk_24)

variables <- c("risk_21","risk_22","risk_23","risk_24")

```

```

ca <- my_reliability(items, itemal=TRUE, NA.Delete=TRUE)

pipealpha <- paste(formatC(round(ca$alpha, digits=2), 2, format = "f"))

temp <- cbind.data.frame(variables, ca$Nobs, ca$Mean, ca$SD, ca$Min, ca$Max, ca$R.With.Total, ca$Alpha.
colnames(temp) <- c("Item", "N", "Average", "Standard Deviation", "Minimum", "Maximum", "Correlation wi
rownames(temp) <- NULL

```

Cronbach's Alpha: 0.34

Table 7: Table continues below

Item	N	Average	Standard Deviation	Minimum	Maximum
risk_21	457	0.5339	0.4994	0	1
risk_22	457	0.4442	0.4974	0	1
risk_23	457	0.3326	0.4717	0	1
risk_24	457	0.05033	0.2189	0	1

Correlation with total	Cronbach's Alpha if item is deleted
0.2816	0.1237
0.1518	0.3103
0.2737	0.1433
-0.04165	0.416

```

cfa <- cfa(aca_cha, data = sem_items)
summary(cfa, fit.measures = TRUE)

```

```

## lavaan (0.5-23.1097) converged normally after 23 iterations
##
##                               Used      Total
##   Number of observations          457        494
##
##   Estimator                      ML
##   Minimum Function Test Statistic    0.000
##   Degrees of freedom                 0
##
## Model test baseline model:
##
##   Minimum Function Test Statistic    56.524
##   Degrees of freedom                 3
##   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) -935.716
## Loglikelihood unrestricted model (H1) -935.716
##
## Number of free parameters 6
## Akaike (AIC) 1883.432
## Bayesian (BIC) 1908.181
## Sample-size adjusted Bayesian (BIC) 1889.138
##
## 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
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## aca_cha =~
## risk_21 1.000
## risk_22 0.423 0.161 2.631 0.009
## risk_23 0.765 0.308 2.484 0.013
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_21 0.158 0.038 4.125 0.000
## .risk_22 0.231 0.017 13.875 0.000
## .risk_23 0.169 0.024 6.949 0.000
## aca_cha 0.091 0.039 2.338 0.019

rm(cfa)
```

Problem Behavior

Item Analysis

```
items <- sem_items %>%
  select(risk_25:risk_30)

variables <- c("risk_25", "risk_26", "risk_27", "risk_28", "risk_29", "risk_30")

ca <- my_reliability(items, itemal=TRUE, NA.Delete=TRUE)

pipealpha <- paste(formatC(round(ca$alpha, digits=2), 2, format = "f"))
```

```
temp <- cbind.data.frame(variables, ca$Nobs, ca$Mean, ca$SD, ca$Min, ca$Max, ca$R.With.Total, ca$Alpha.
colnames(temp) <- c("Item", "N", "Average", "Standard Deviation", "Minimum", "Maximum", "Correlation wi
rownames(temp) <- NULL
```

Cronbach's Alpha: 0.63

Table 9: Table continues below

Item	N	Average	Standard Deviation	Minimum	Maximum
risk_25	456	0.239	0.427	0	1
risk_26	456	0.1491	0.3566	0	1
risk_27	456	0.2215	0.4157	0	1
risk_28	456	0.05921	0.2363	0	1
risk_29	456	0.01096	0.1043	0	1
risk_30	456	0.1075	0.31	0	1

Correlation with total	Cronbach's Alpha if item is deleted
0.4278	0.5627
0.4533	0.5475
0.469	0.5394
0.3822	0.588
0.2056	0.6398
0.2918	0.6118

```
cfa <- cfa(prob_be, data = sem_items)
summary(cfa, fit.measures = TRUE)
```

```
## lavaan (0.5-23.1097) converged normally after 31 iterations
##
##                               Used      Total
##   Number of observations          456      494
##
##   Estimator                      ML
##   Minimum Function Test Statistic    41.923
##   Degrees of freedom                 5
##   P-value (Chi-square)              0.000
##
## Model test baseline model:
##
##   Minimum Function Test Statistic    293.209
##   Degrees of freedom                 10
##   P-value                           0.000
##
## User model versus baseline model:
##
##   Comparative Fit Index (CFI)        0.870
##   Tucker-Lewis Index (TLI)          0.739
##
## Loglikelihood and Information Criteria:
##
##   Loglikelihood user model (H0)      -656.581
```

```
## Loglikelihood unrestricted model (H1) -635.620
##
## Number of free parameters 10
## Akaike (AIC) 1333.162
## Bayesian (BIC) 1374.387
## Sample-size adjusted Bayesian (BIC) 1342.650
##
## Root Mean Square Error of Approximation:
##
## RMSEA 0.127
## 90 Percent Confidence Interval 0.093 0.164
## P-value RMSEA <= 0.05 0.000
##
## Standardized Root Mean Square Residual:
##
## SRMR 0.057
##
## Parameter Estimates:
##
## Information Expected
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## prob_be =~
## risk_25 1.000
## risk_26 0.823 0.110 7.472 0.000
## risk_27 1.090 0.141 7.748 0.000
## risk_28 0.442 0.067 6.623 0.000
## risk_30 0.458 0.082 5.578 0.000
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_25 0.123 0.011 11.358 0.000
## .risk_26 0.087 0.008 11.523 0.000
## .risk_27 0.102 0.010 9.771 0.000
## .risk_28 0.044 0.003 13.114 0.000
## .risk_30 0.084 0.006 13.984 0.000
## prob_be 0.059 0.011 5.176 0.000
```

`rm(cfa)`

Mental Health Challenges

Item Analysis

```
items <- sem_items %>%
  select( risk_31, risk_32)

variables <- c("risk_31","risk_32")

ca <- my_reliability(items, itemal=TRUE, NA.Delete=TRUE)
```

```
pipealpha <- paste(formatC(round(ca$alpha, digits=2), 2, format = "f"))
```

```
temp <- cbind.data.frame(variables, ca$Nobs, ca$Mean, ca$SD, ca$Min, ca$Max, ca$R.With.Total)
colnames(temp) <- c("Item", "N", "Average", "Standard Deviation", "Minimum", "Maximum", "Correlation with total")
rownames(temp) <- NULL
```

Cronbach's Alpha NA (2-items scale)

Table 11: Table continues below

Item	N	Average	Standard Deviation	Minimum	Maximum
risk_31	458	0.441	0.4971	0	1
risk_32	458	0.4236	0.4947	0	1

Correlation with total
0.3154
0.3154

```
cfa <- cfa(men_he, data = sem_items)
```

```
## Warning in lav_model_vcov(lavmodel = lavmodel, lavsamplestats = lavsamplestats, : lavaan WARNING: covariance matrix is not positive definite
## lavaan NOTE: this may be a symptom that the model is not identified.
```

```
summary(cfa, fit.measures = TRUE)
```

```
## lavaan (0.5-23.1097) converged normally after 11 iterations
```

```
##
##                               Used      Total
## Number of observations          458      494
##
## Estimator                      ML
## Minimum Function Test Statistic NA
## Degrees of freedom              -1
##
```

```
## User model versus baseline model:
```

```
##
## Comparative Fit Index (CFI)      NA
## Tucker-Lewis Index (TLI)        NA
##
```

```
## Loglikelihood and Information Criteria:
```

```
##
## Loglikelihood user model (H0)    -632.217
## Loglikelihood unrestricted model (H1) -632.217
##
```

```
## Number of free parameters         4
## Akaike (AIC)                     1272.433
## Bayesian (BIC)                   1288.941
## Sample-size adjusted Bayesian (BIC) 1276.246
##
```

```
## Root Mean Square Error of Approximation:
```

```
##
```



```
## RMSEA NA
## 90 Percent Confidence Interval NA NA
## P-value RMSEA <= 0.05 NA
##
## Standardized Root Mean Square Residual:
##
## SRMR 0.000
##
## Parameter Estimates:
##
## Information Expected
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## men_he =~
## risk_31 1.000
## risk_32 0.395 NA
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_31 0.051 NA
## .risk_32 0.214 NA
## men_he 0.196 NA
```

`rm(cfa)`

SEM

Models

Current problems with model convergence when identifying the overall environmental & individual risk factors scale. I will also take all items loaded onto the environmental & individual risk factors scale. This will be model 2.

```
model1 <- "
  #Environmental risk factors
  eco_risk =~ risk_1 + risk_2 + risk_3 + risk_4 + risk_5 + risk_6 + risk_7
  fam_str  =~ risk_8 + risk_9 + risk_10 + risk_11 + risk_12 + risk_13 + risk_14 + risk_15 + ri
  peer_dif =~ risk_19 + risk_20

  #Individual Risk factors
  aca_cha  =~ risk_21 + risk_22 + risk_23          #+risk_24
  prob_be  =~ risk_25 + risk_26 + risk_27 + risk_28 + risk_30  #+ risk_29
  men_he   =~ risk_31 + risk_32

  #env_risk =~ eco_risk + fam_str + peer_dif
  #ind_risk =~ aca_cha + prob_be + men_he

  #risk =~ env_risk + ind_risk
"

model2 <- "
```

```

#Environmental risk factors
env_risk =~ risk_1 + risk_2 + risk_3 + risk_4 + risk_5 + risk_6 + risk_7 +
risk_8 + risk_9 + risk_10 + risk_11 + risk_12 + risk_13 + risk_14 + risk_15 + risk_16 + risk_
risk_19 + risk_20

#Individual Risk factors
ind_risk =~ risk_21 + risk_22 + risk_23 + risk_24
risk_25 + risk_26 + risk_27 + risk_28 + risk_30 + risk_29
risk_31 + risk_32

# risk =~ env_risk + ind_risk

```

Fit Model 1

```

fit <-sem(model1, sem_items)
summary(fit, fit.measures =TRUE)

```

```

## lavaan (0.5-23.1097) converged normally after 272 iterations
##
##                               Used      Total
##   Number of observations           450        494
##
##   Estimator                        ML
##   Minimum Function Test Statistic    1053.146
##   Degrees of freedom                 390
##   P-value (Chi-square)               0.000
##
## Model test baseline model:
##
##   Minimum Function Test Statistic    2235.313
##   Degrees of freedom                 435
##   P-value                           0.000
##
## User model versus baseline model:
##
##   Comparative Fit Index (CFI)        0.632
##   Tucker-Lewis Index (TLI)          0.589
##
## Loglikelihood and Information Criteria:
##
##   Loglikelihood user model (H0)      -5241.215
##   Loglikelihood unrestricted model (H1) -4714.642
##
##   Number of free parameters           75
##   Akaike (AIC)                       10632.431
##   Bayesian (BIC)                     10940.624
##   Sample-size adjusted Bayesian (BIC) 10702.603
##
## Root Mean Square Error of Approximation:
##

```

```

##      RMSEA                                0.061
##      90 Percent Confidence Interval          0.057 0.066
##      P-value RMSEA <= 0.05                  0.000
##
## Standardized Root Mean Square Residual:
##
##      SRMR                                0.071
##
## Parameter Estimates:
##
##      Information                                Expected
##      Standard Errors                          Standard
##
## Latent Variables:
##      Estimate  Std.Err  z-value  P(>|z|)
##      eco_risk =~
##      risk_1      1.000
##      risk_2      0.384    0.152    2.528    0.011
##      risk_3      1.735    0.436    3.981    0.000
##      risk_4      0.681    0.215    3.174    0.002
##      risk_5      2.258    0.495    4.565    0.000
##      risk_6      3.679    0.761    4.832    0.000
##      risk_7      3.572    0.741    4.819    0.000
##      fam_str =~
##      risk_8      1.000
##      risk_9      1.402    0.288    4.864    0.000
##      risk_10     3.777    0.619    6.102    0.000
##      risk_11     3.581    0.576    6.215    0.000
##      risk_12     1.564    0.462    3.383    0.001
##      risk_13     2.225    0.418    5.324    0.000
##      risk_14     0.979    0.261    3.752    0.000
##      risk_15     1.734    0.443    3.915    0.000
##      risk_16     1.362    0.372    3.657    0.000
##      risk_17     1.090    0.307    3.545    0.000
##      risk_18     2.279    0.513    4.445    0.000
##      peer_dif =~
##      risk_19     1.000
##      risk_20     2.292    0.684    3.353    0.001
##      aca_cha =~
##      risk_21     1.000
##      risk_22     1.440    0.275    5.227    0.000
##      risk_23     0.926    0.208    4.449    0.000
##      prob_be =~
##      risk_25     1.000
##      risk_26     0.772    0.103    7.462    0.000
##      risk_27     1.017    0.129    7.912    0.000
##      risk_28     0.452    0.065    6.956    0.000
##      risk_30     0.488    0.082    5.976    0.000
##      men_he =~
##      risk_31     1.000
##      risk_32     1.074    0.155    6.942    0.000
##
## Covariances:
##      Estimate  Std.Err  z-value  P(>|z|)

```

```

## eco_risk ~~
##   fam_str      0.001    0.000    2.399    0.016
##   peer_dif     -0.001    0.001   -1.123    0.262
##   aca_cha       0.001    0.001    0.822    0.411
##   prob_be       0.000    0.001    0.270    0.787
##   men_he       -0.003    0.002   -1.733    0.083
## fam_str ~~
##   peer_dif      0.001    0.001    1.351    0.177
##   aca_cha       0.001    0.001    0.766    0.444
##   prob_be       0.005    0.001    3.467    0.001
##   men_he       0.002    0.001    1.581    0.114
## peer_dif ~~
##   aca_cha       0.016    0.006    2.912    0.004
##   prob_be       0.004    0.003    1.390    0.164
##   men_he       0.025    0.008    3.199    0.001
## aca_cha ~~
##   prob_be       0.024    0.006    4.188    0.000
##   men_he       0.042    0.009    4.772    0.000
## prob_be ~~
##   men_he       0.030    0.007    4.509    0.000
##
## Variances:
##           Estimate Std.Err  z-value  P(>|z|)
##   .risk_1      0.095   0.006   14.591   0.000
##   .risk_2      0.043   0.003   14.869   0.000
##   .risk_3      0.182   0.013   14.354   0.000
##   .risk_4      0.070   0.005   14.744   0.000
##   .risk_5      0.114   0.009   13.192   0.000
##   .risk_6      0.073   0.010    7.246   0.000
##   .risk_7      0.109   0.011    9.721   0.000
##   .risk_8      0.026   0.002   13.930   0.000
##   .risk_9      0.058   0.004   14.058   0.000
##   .risk_10     0.108   0.010   11.238   0.000
##   .risk_11     0.073   0.007   10.055   0.000
##   .risk_12     0.222   0.015   14.698   0.000
##   .risk_13     0.097   0.007   13.590   0.000
##   .risk_14     0.066   0.005   14.600   0.000
##   .risk_15     0.183   0.013   14.548   0.000
##   .risk_16     0.137   0.009   14.628   0.000
##   .risk_17     0.095   0.007   14.658   0.000
##   .risk_18     0.212   0.015   14.324   0.000
##   .risk_19     0.202   0.014   13.929   0.000
##   .risk_20     0.165   0.030    5.462   0.000
##   .risk_21     0.217   0.016   13.591   0.000
##   .risk_22     0.181   0.017   10.674   0.000
##   .risk_23     0.193   0.014   13.650   0.000
##   .risk_25     0.122   0.011   11.514   0.000
##   .risk_26     0.091   0.007   12.218   0.000
##   .risk_27     0.111   0.010   11.015   0.000
##   .risk_28     0.042   0.003   12.961   0.000
##   .risk_30     0.083   0.006   13.792   0.000
##   .risk_31     0.174   0.016   11.102   0.000
##   .risk_32     0.160   0.016    9.897   0.000
##   eco_risk     0.007   0.003    2.516   0.012

```

##	fam_str	0.004	0.001	3.467	0.001
##	peer_dif	0.016	0.008	2.099	0.036
##	aca_cha	0.032	0.011	3.034	0.002
##	prob_be	0.060	0.011	5.325	0.000
##	men_he	0.072	0.016	4.593	0.000

Fit model 2

```
fit2 <-sem(model2, sem_items)
summary(fit2, fit.measures =TRUE)
```

```
## lavaan (0.5-23.1097) converged normally after 155 iterations
##
##                               Used      Total
##   Number of observations           450        494
##
##   Estimator                        ML
##   Minimum Function Test Statistic    1372.673
##   Degrees of freedom                 404
##   P-value (Chi-square)               0.000
##
## Model test baseline model:
##
##   Minimum Function Test Statistic    2235.313
##   Degrees of freedom                 435
##   P-value                           0.000
##
## User model versus baseline model:
##
##   Comparative Fit Index (CFI)        0.462
##   Tucker-Lewis Index (TLI)          0.421
##
## Loglikelihood and Information Criteria:
##
##   Loglikelihood user model (H0)      -5400.979
##   Loglikelihood unrestricted model (H1) -4714.642
##
##   Number of free parameters           61
##   Akaike (AIC)                       10923.958
##   Bayesian (BIC)                     11174.622
##   Sample-size adjusted Bayesian (BIC) 10981.031
##
## Root Mean Square Error of Approximation:
##
##   RMSEA                             0.073
##   90 Percent Confidence Interval      0.069 0.077
##   P-value RMSEA <= 0.05              0.000
##
## Standardized Root Mean Square Residual:
##
##   SRMR                              0.082
##
## Parameter Estimates:
```

```

##
## Information Expected
## Standard Errors Standard
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## env_risk =~
## risk_1 1.000
## risk_2 0.543 0.165 3.288 0.001
## risk_3 1.943 0.457 4.249 0.000
## risk_4 0.810 0.226 3.587 0.000
## risk_5 2.031 0.449 4.529 0.000
## risk_6 3.052 0.626 4.875 0.000
## risk_7 3.392 0.693 4.892 0.000
## risk_8 0.213 0.115 1.858 0.063
## risk_9 0.352 0.172 2.042 0.041
## risk_10 0.586 0.277 2.111 0.035
## risk_11 0.844 0.272 3.103 0.002
## risk_12 2.493 0.552 4.517 0.000
## risk_13 0.980 0.281 3.488 0.000
## risk_14 0.465 0.185 2.507 0.012
## risk_15 0.819 0.314 2.610 0.009
## risk_16 0.869 0.286 3.038 0.002
## risk_17 1.346 0.318 4.229 0.000
## risk_18 1.766 0.445 3.972 0.000
## risk_19 0.233 0.293 0.796 0.426
## risk_20 -0.218 0.313 -0.697 0.486
## ind_risk =~
## risk_21 1.000
## risk_22 0.855 0.207 4.137 0.000
## risk_23 1.030 0.217 4.740 0.000
## risk_25 1.315 0.242 5.440 0.000
## risk_26 1.073 0.199 5.402 0.000
## risk_27 1.301 0.238 5.467 0.000
## risk_28 0.617 0.120 5.154 0.000
## risk_30 0.717 0.148 4.852 0.000
## risk_31 1.025 0.223 4.597 0.000
## risk_32 1.011 0.221 4.576 0.000
##
## Covariances:
## Estimate Std.Err z-value P(>|z|)
## env_risk ~~
## ind_risk 0.001 0.001 1.217 0.224
##
## Variances:
## Estimate Std.Err z-value P(>|z|)
## .risk_1 0.094 0.006 14.577 0.000
## .risk_2 0.042 0.003 14.721 0.000
## .risk_3 0.175 0.012 14.137 0.000
## .risk_4 0.069 0.005 14.618 0.000
## .risk_5 0.120 0.009 13.614 0.000
## .risk_6 0.102 0.009 11.273 0.000
## .risk_7 0.115 0.011 10.938 0.000
## .risk_8 0.030 0.002 14.939 0.000

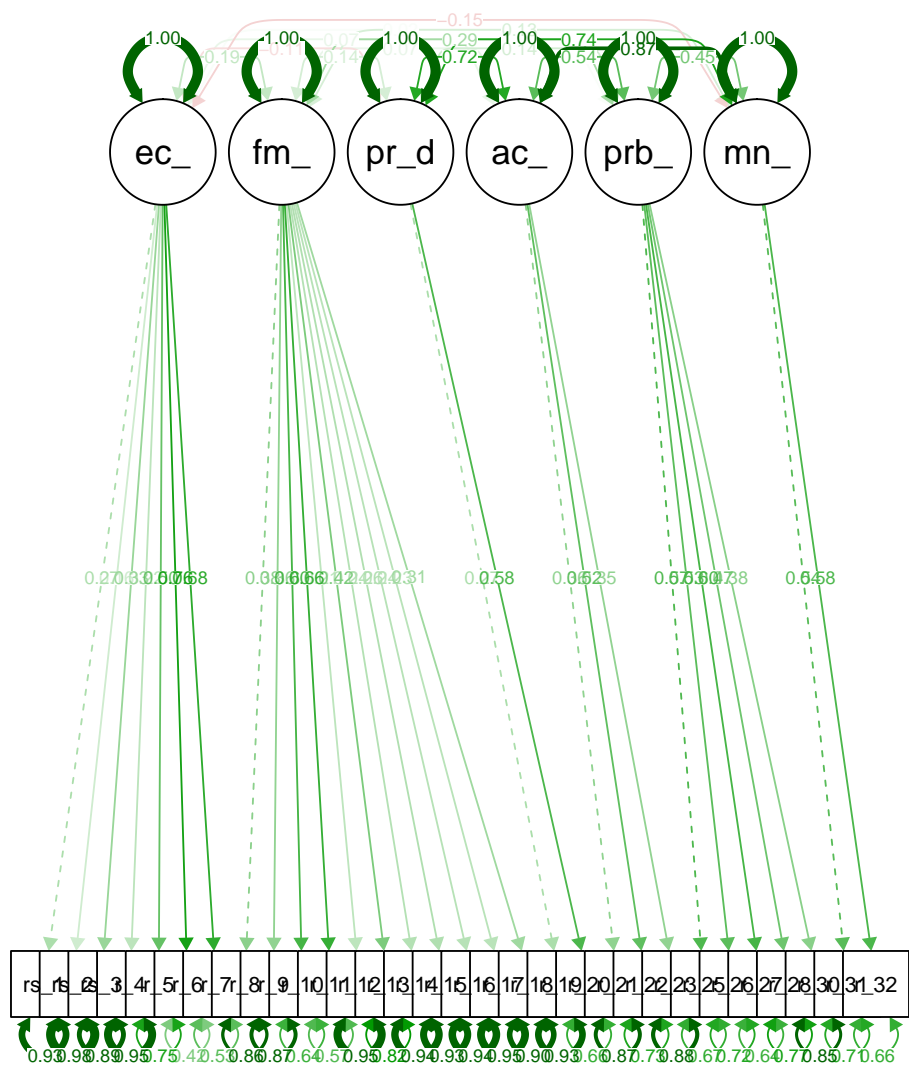
```

##	.risk_9	0.065	0.004	14.924	0.000
##	.risk_10	0.166	0.011	14.918	0.000
##	.risk_11	0.123	0.008	14.769	0.000
##	.risk_12	0.185	0.014	13.645	0.000
##	.risk_13	0.111	0.008	14.656	0.000
##	.risk_14	0.068	0.005	14.874	0.000
##	.risk_15	0.190	0.013	14.860	0.000
##	.risk_16	0.139	0.009	14.783	0.000
##	.risk_17	0.086	0.006	14.161	0.000
##	.risk_18	0.210	0.015	14.405	0.000
##	.risk_19	0.217	0.014	14.990	0.000
##	.risk_20	0.250	0.017	14.992	0.000
##	.risk_21	0.219	0.016	14.117	0.000
##	.risk_22	0.225	0.016	14.373	0.000
##	.risk_23	0.189	0.014	13.912	0.000
##	.risk_25	0.131	0.011	12.425	0.000
##	.risk_26	0.093	0.007	12.576	0.000
##	.risk_27	0.123	0.010	12.308	0.000
##	.risk_28	0.043	0.003	13.284	0.000
##	.risk_30	0.082	0.006	13.780	0.000
##	.risk_31	0.215	0.015	14.053	0.000
##	.risk_32	0.213	0.015	14.072	0.000
##	env_risk	0.008	0.003	2.567	0.010
##	ind_risk	0.030	0.009	3.142	0.002

Diagrams

Model 1

```
semPaths(fit, "std", title = FALSE, curvePivot = TRUE)
```



##Model 2

```
semPaths(fit2, "std", title = FALSE, curvePivot = TRUE)
```