My short analysis

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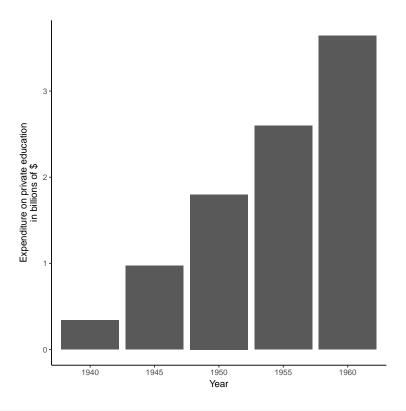
March 24, 2017

The results below are generated from an R script.

```
# First we load the packages
library(tidyr)
library(ggplot2)
library(Hmisc)
library(psych)
pers_exp <- USPersonalExpenditure</pre>
# Let's look at the data
pers_exp #it looks like the row names are not actually in the matrix
##
                        1940
                              1945 1950 1955 1960
## Food and Tobacco
                    22.200 44.500 59.60 73.2 86.80
## Household Operation 10.500 15.500 29.00 36.5 46.20
## Medical and Health 3.530 5.760 9.71 14.0 21.10
## Personal Care 1.040 1.980 2.45 3.4 5.40
## Private Education 0.341 0.974 1.80 2.6 3.64
                #let's fix that
expenditure_type <- rownames(pers_exp)</pre>
expenditure_type <- gsub( ' ' , '_' , expenditure_type) # Replace spaces with underscores
rownames(pers_exp) <- NULL</pre>
pers_exp <- as.data.frame(pers_exp)</pre>
pers_exp <- cbind(expenditure_type,pers_exp)</pre>
# Let's look at the data now
pers_exp
              #better, but it doesn't look tidy to me
##
        expenditure_type 1940
                                1945 1950 1955 1960
        Food_and_Tobacco 22.200 44.500 59.60 73.2 86.80
## 2 Household_Operation 10.500 15.500 29.00 36.5 46.20
## 3 Medical_and_Health 3.530 5.760 9.71 14.0 21.10
## 4
           Personal_Care 1.040 1.980 2.45 3.4 5.40
## 5
      Private_Education 0.341 0.974 1.80 2.6 3.64
                #let's fix that
pers_exp <- gather( pers_exp , `1940` , `1945` , `1950` , `1955` , `1960` ,</pre>
```

^{*}This report is automatically generated with the R package knitr (version 1.15.1).

```
key = year, value = expenditure)
pers_exp <- spread( pers_exp , key = expenditure_type , value = expenditure)</pre>
# Let's look at the data now
pers_exp
              #better
## year Food_and_Tobacco Household_Operation Medical_and_Health Personal_Care
## 1 1940
                    22.2
                                       10.5
                                                         3.53
                                                                      1.04
## 2 1945
                    44.5
                                       15.5
                                                         5.76
                                                                      1.98
## 3 1950
                    59.6
                                       29.0
                                                        9.71
                                                                     2.45
## 4 1955
                    73.2
                                       36.5
                                                        14.00
                                                                     3.40
## 5 1960
                    86.8
                                       46.2
                                                        21.10
                                                                      5.40
## Private Education
              0.341
## 1
## 2
               0.974
## 3
                1.800
## 4
                2.600
## 5
                3.640
# We should now look at some descriptive stats
# Let's use the describe function from the psych package
psych::describe(pers_exp)
##
                                    sd median trimmed mad
                     vars n
                              mean
                                                                 min
                                                                         max range
## year*
                       1 5 1950.00 7.91 1950.00 1950.00 7.41 1940.00 1960.00 20.00
## Food_and_Tobacco
                       2 5 57.26 25.12 59.60 57.26 22.39 22.20
                                                                       86.80 64.60
                      3 5 27.54 14.71
## Household_Operation
                                           29.00 27.54 20.02 10.50 46.20 35.70
## Medical and Health
                     4 5 10.82 7.00
                                         9.71 10.82 6.36 3.53 21.10 17.57
## Personal Care
                      5 5 2.85 1.66
                                         2.45 2.85 1.41 1.04 5.40 4.36
                             1.87 1.30
                                         1.80 1.87 1.22 0.34 3.64 3.30
                      6 5
## Private Education
                     skew kurtosis
                                      se
## year*
                      0.00 -1.91 3.54
## Food_and_Tobacco
                   -0.19
                             -1.81 11.23
## Household Operation 0.03
                             -2.01 6.58
## Medical and Health 0.35
                             -1.77 3.13
## Personal_Care 0.44
                             -1.58 \quad 0.74
## Private_Education 0.15 -1.88 0.58
# Okay, that's nice but we really just want the Private Education info
psych::describe(pers_exp$Private_Education)
     vars n mean sd median trimmed mad min max range skew kurtosis
##
                           1.87 1.22 0.34 3.64 3.3 0.15
## X1 1 5 1.87 1.3 1.8
# This shows a difference between the minumum and maximum values
# with both the mean and median roughly in between.
# This would suggest a general change, but we cannot be sure of the direction.
# A plot might help with this
# Plot private education over time
ggplot( pers_exp , aes( year , Private_Education))+
       geom_bar(stat='identity')+
       labs( x = 'Year' , y = 'Expenditure on private education\nin billions of $') +
     theme_classic()
```

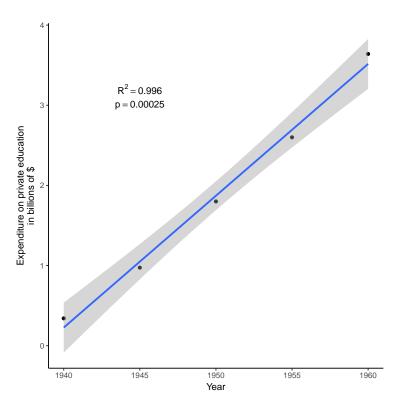


```
# This plot shows that expenditure on Private Education has
# increased between 1940 and 1960.

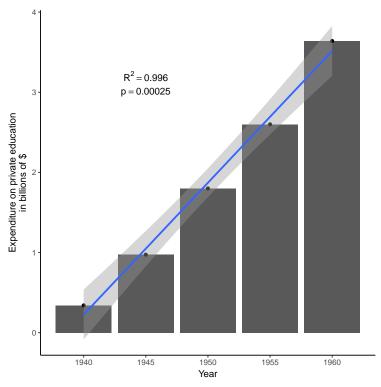
# Let's now see if the correlation between these values is significant

# First calculate correlation and p-value
cor_vals <- rcorr( pers_exp$year , pers_exp$Private_Education )

# Straight up scatter plot
ggplot( pers_exp , aes( x = as.numeric(year) , y = Private_Education)) +
    geom_point() +
    geom_smooth(method='lm') +
    annotate('text' , x = 1945 , y = 3.2 ,
        label = paste('R^2 == ' , round(cor_vals$r[1,2],3) , sep=''), parse = T) +
    annotate('text' , x = 1945 , y = 3 ,
        label = paste('p ==' , round(cor_vals$P[1,2],5) , sep=''), parse = T) +
    labs(x = 'Year' , y = 'Expenditure on private education\nin billions of $') +
    theme_classic()</pre>
```



```
# Bar plot with scatter plot overlay
ggplot( pers_exp , aes( x = as.numeric(year) , y = Private_Education)) +
geom_bar(stat='identity')+
geom_point() +
geom_smooth(method='lm') +
annotate('text' , x = 1945 , y = 3.2 ,
    label = paste('R^2 == ' , round(cor_vals$r[1,2],3) , sep=''), parse = T) +
annotate('text' , x = 1945 , y = 3 ,
    label = paste('p ==', round(cor_vals$P[1,2],5) , sep=''), parse = T) +
labs(x = 'Year' , y = 'Expenditure on private education\nin billions of $') +
theme_classic()
```



The R session information (including the OS info, R version and all packages used):

```
sessionInfo()
## R version 3.3.2 (2016-10-31)
## Platform: x86 64-pc-linux-gnu (64-bit)
## Running under: Ubuntu 16.04.2 LTS
##
## locale:
   [1] LC_CTYPE=en_GB.UTF-8
                                   LC NUMERIC=C
                                                              LC TIME=en GB.UTF-8
   [4] LC_COLLATE=en_GB.UTF-8
                                   LC MONETARY=en GB.UTF-8
                                                              LC_MESSAGES=en_GB.UTF-8
   [7] LC_PAPER=en_GB.UTF-8
                                   LC NAME=C
                                                              LC ADDRESS=C
## [10] LC_TELEPHONE=C
                                   LC_MEASUREMENT=en_GB.UTF-8 LC_IDENTIFICATION=C
##
## attached base packages:
## [1] stats
                 graphics grDevices utils
                                               datasets methods
                                                                   base
##
## other attached packages:
## [1] tidyr_0.6.1
                   knitr_1.15.1
                                       Hmisc_4.0-1
                                                       Formula_1.2-1
                                                                       survival_2.40-1
## [6] lattice_0.20-34 ggplot2_2.2.1
                                       psych_1.6.12
##
## loaded via a namespace (and not attached):
                                                                    highr 0.6
   [1] Rcpp 0.12.10
                            RColorBrewer 1.1-2 plyr 1.8.4
##
   [5] tools_3.3.2
                            rpart_4.1-10
                                                digest_0.6.12
                                                                     base64 2.0
                                                gtable_0.2.0
   [9] evaluate 0.10
                            tibble 1.2
                                                                    htmlTable 1.7
## [13] Matrix_1.2-7.1
                            DBI_0.6
                                                parallel_3.3.2
                                                                     gridExtra_2.2.1
## [17] stringr_1.2.0
                            dplyr_0.5.0
                                                cluster_2.0.5
                                                                     grid_3.3.2
## [21] nnet_7.3-12
                                                R6_2.2.0
                                                                     foreign_0.8-67
                            data.table_1.10.0
## [25] latticeExtra_0.6-28 magrittr_1.5
                                                scales_0.4.1
                                                                    htmltools_0.3.5
## [29] splines_3.3.2
                                                                     colorspace_1.3-2
                            assertthat_0.1
                                                mnormt_1.5-5
## [33] labeling_0.3
                                                                    lazyeval_0.2.0
                          stringi_1.1.2
                                                acepack_1.4.1
```

```
## [37] openssl_0.9.5 munsell_0.4.3

Sys.time()
## [1] "2017-03-24 12:55:31 GMT"
```