

# DATA 606: Project: Gold vs Silver Price

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## Topic: Correlation between Gold and Silver Prices

### Introduction:

Silver and gold are close substitutes for one another. Both have been used as currency in the past. There is significant evidence that these metals being an attractive investment and can play a useful role in diversifying risk. There are also economic fundamentals that may act to drive the prices of silver and gold apart.

### Research question:

The main objective of this project is to study the relationship and correlation between prices of silver and gold in commodity market.

### Data Source:

The datasets for this project are from the following sites:

1. <https://www.quandl.com/data/LBMA/GOLD-Gold-Price-London-Fixing>  
(<https://www.quandl.com/data/LBMA/GOLD-Gold-Price-London-Fixing>)
2. <https://www.quandl.com/data/LBMA/SILVER-Silver-Price-London-Fixing>  
(<https://www.quandl.com/data/LBMA/SILVER-Silver-Price-London-Fixing>)

### Cases:

Each case represents the price of silver and gold for a day. The full dataset represents data for 48 years with approximately 12618 cases.

### Data Collection:

The data is collected from [quandl.com](https://www.quandl.com)

### Type of study:

This is observational study.

### Response:

Price of gold is the response variable. It is numerical continuous variable.

### Explanatory:

The explanatory variable is the price of silver and is numerical.

### Setup

```
#install.packages("tidyr")
#install.packages("magrittr")
#install.packages("sqldf")
#install.packages("ggplot2")
#install.packages("dplyr")
library(tidyr)
```

```
## Warning: package 'tidyr' was built under R version 3.4.2
```

```
library(dplyr)
```

```
## Warning: package 'dplyr' was built under R version 3.4.2
```

```
##
## Attaching package: 'dplyr'
```

```
## The following objects are masked from 'package:stats':
##
##     filter, lag
```

```
## The following objects are masked from 'package:base':
##
##     intersect, setdiff, setequal, union
```

```
library(ggplot2)
library(sqldf)
```

```
## Loading required package: gsubfn
```

```
## Loading required package: proto
```

```
## Warning in doTryCatch(return(expr), name, parentenv, handler): unable to load shared
object '/Library/Frameworks/R.framework/Resources/modules//R_X11.so':
##   dlopen(/Library/Frameworks/R.framework/Resources/modules//R_X11.so, 6): Library not
loaded: /opt/X11/lib/libfontconfig.1.dylib
##   Referenced from: /Library/Frameworks/R.framework/Resources/modules//R_X11.so
##   Reason: Incompatible library version: R_X11.so requires version 11.0.0 or later, bu
t libfontconfig.1.dylib provides version 10.0.0
```

```
## Could not load tcltk. Will use slower R code instead.
```

```
## Loading required package: RSQLite
```

```
library(magrittr)
```

```
##
## Attaching package: 'magrittr'
```

```
## The following object is masked from 'package:tidyr':
##
##      extract
```

### Silver and Gold price data are loaded from the datasets

```
gold_df <- read.csv(file="/Users/anjalhussan/Desktop/data_science/proposal/GOLD.csv", head=TRUE, sep=",", stringsAsFactors = FALSE)
head(gold_df)
```

```
##           Date USD..AM. USD..PM. GBP..AM. GBP..PM. EURO..AM. EURO..PM.
## 1 2017-11-30 1282.15 1280.20  952.64  948.88 1084.06 1074.98
## 2 2017-11-29 1294.85 1283.85  965.70  957.50 1092.46 1085.11
## 3 2017-11-28 1293.90 1291.85  972.75  974.18 1088.95 1087.61
## 4 2017-11-27 1294.70 1294.90  969.73  969.36 1084.83 1085.00
## 5 2017-11-24 1289.15 1290.50  967.89  966.58 1086.37 1082.60
## 6 2017-11-23 1290.15 1290.35  969.93  969.96 1089.40 1089.18
```

```
silver_df = read.csv(file="/Users/anjalhussan/Desktop/data_science/proposal/SILVER.csv", head=TRUE, sep=",", stringsAsFactors = FALSE)
head(silver_df)
```

```
##           Date    USD    GBP    EURO
## 1 2017-11-30 16.570 12.32 14.00
## 2 2017-11-29 16.895 12.60 14.26
## 3 2017-11-28 17.070 12.84 14.36
## 4 2017-11-27 17.100 12.81 14.32
## 5 2017-11-24 17.050 12.80 14.38
## 6 2017-11-23 17.095 12.84 14.43
```

## Data Transformation, Cleanup and Preparation:

Apply tidyr select function and select only columns (Date and USD..AM Price) from gold\_df data set that are relevant for our purpose

```
select(gold_df)
```

```
## data frame with 0 columns and 12618 rows
```

```
gold_dataSet = select (gold_df, matches("Date|USD..AM"))
```

Apply tidyr mutate function to identify the price of the metal as gold

```
gold_dataSet = mutate (gold_dataSet, MetalPrice = "GoldPrice")
colnames(gold_dataSet)[2] <- "USD"
head(gold_dataSet)
```

```
##           Date      USD MetalPrice
## 1 2017-11-30 1282.15   GoldPrice
## 2 2017-11-29 1294.85   GoldPrice
## 3 2017-11-28 1293.90   GoldPrice
## 4 2017-11-27 1294.70   GoldPrice
## 5 2017-11-24 1289.15   GoldPrice
## 6 2017-11-23 1290.15   GoldPrice
```

Apply tidyr select function and select only columns (Date and USD Price) form silver\_df data set that are relevant for our purpose. Also Apply tidyr mutate function to identify the price of the metal as Silver

```
select(silver_df)
```

```
## data frame with 0 columns and 12628 rows
```

```
Silver_dataSet = select (silver_df, matches("Date|USD"))
silver_df$Date = as.Date(as.character(silver_df$Date))
Silver_dataSet = mutate (Silver_dataSet, MetalPrice = "SilverPrice")
head(Silver_dataSet)
```

```
##           Date      USD MetalPrice
## 1 2017-11-30 16.570 SilverPrice
## 2 2017-11-29 16.895 SilverPrice
## 3 2017-11-28 17.070 SilverPrice
## 4 2017-11-27 17.100 SilverPrice
## 5 2017-11-24 17.050 SilverPrice
## 6 2017-11-23 17.095 SilverPrice
```

Now combine both data frames (Silver and Gold price data frames) into one consolidated data frame for analysis

```
Silver_dataSet <- Silver_dataSet[1:nrow(gold_dataSet),1:3]
gold_dataSet <- gold_dataSet[,1:3]
#do.call(rbind, gold_dataSet)
combinedDataSets = rbind(gold_dataSet, Silver_dataSet)
head(combinedDataSets)
```

```
##           Date      USD MetalPrice
## 1 2017-11-30 1282.15   GoldPrice
## 2 2017-11-29 1294.85   GoldPrice
## 3 2017-11-28 1293.90   GoldPrice
## 4 2017-11-27 1294.70   GoldPrice
## 5 2017-11-24 1289.15   GoldPrice
## 6 2017-11-23 1290.15   GoldPrice
```

Apply arrange function to sort the data by Date

```
combinedDataSets = arrange(combinedDataSets, Date)
head(combinedDataSets)
```

```
##           Date   USD MetalPrice
## 1 1968-01-02 35.18   GoldPrice
## 2 1968-01-03 35.16   GoldPrice
## 3 1968-01-04 35.14   GoldPrice
## 4 1968-01-05 35.14   GoldPrice
## 5 1968-01-08 35.14   GoldPrice
## 6 1968-01-09 35.14   GoldPrice
```

Apply spread function to spread the data for each metal by adding one column for Gold and another for Silver

```
spreadedTotal = spread(combinedDataSets, MetalPrice, USD)
head(spreadedTotal, 20)
```

```
##           Date GoldPrice SilverPrice
## 1 1968-01-02      35.18           NA
## 2 1968-01-03      35.16           NA
## 3 1968-01-04      35.14           NA
## 4 1968-01-05      35.14           NA
## 5 1968-01-08      35.14           NA
## 6 1968-01-09      35.14           NA
## 7 1968-01-10      35.15           NA
## 8 1968-01-11      35.17           NA
## 9 1968-01-12      35.18           NA
## 10 1968-01-15      35.18           NA
## 11 1968-01-16      35.19      2.069
## 12 1968-01-17      35.20      2.067
## 13 1968-01-18      35.20      2.058
## 14 1968-01-19      35.19      2.078
## 15 1968-01-22      35.19      2.088
## 16 1968-01-23      35.19      2.080
## 17 1968-01-24      35.20      2.064
## 18 1968-01-25      35.20      2.018
## 19 1968-01-26      35.20      2.069
## 20 1968-01-29      35.19      2.039
```

Create a function to calculate the price ratio and round it to 4 decimal digits

```
calcPriceRatio = function(goldPrice, silverPrice)
{
  round((goldPrice/silverPrice), 4)
}
```

Apply tidyr mutate function to add PriceRatio and transactionYear columns

```
dataSetsWithPriceRatio = mutate(spreadedTotal, PriceRatio=calcPriceRatio(GoldPrice, SilverPrice), transactionYear=substring(Date,1,4))
tail(dataSetsWithPriceRatio, 20)
```

##	Date	GoldPrice	SilverPrice	PriceRatio	transactionYear
## 12611	2017-11-03	1275.30	17.085	74.6444	2017
## 12612	2017-11-06	1271.60	16.915	75.1759	2017
## 12613	2017-11-07	1276.35	17.005	75.0573	2017
## 12614	2017-11-08	1282.25	16.995	75.4487	2017
## 12615	2017-11-09	1284.00	17.100	75.0877	2017
## 12616	2017-11-10	1284.45	17.000	75.5559	2017
## 12617	2017-11-13	1278.40	16.925	75.5332	2017
## 12618	2017-11-14	1273.70	16.935	75.2111	2017
## 12619	2017-11-15	1285.70	17.115	75.1212	2017
## 12620	2017-11-16	1277.70	17.040	74.9824	2017
## 12621	2017-11-17	1283.85	17.085	75.1449	2017
## 12622	2017-11-20	1292.35	17.145	75.3777	2017
## 12623	2017-11-21	1280.00	17.000	75.2941	2017
## 12624	2017-11-22	1283.95	16.965	75.6823	2017
## 12625	2017-11-23	1290.15	17.095	75.4694	2017
## 12626	2017-11-24	1289.15	17.050	75.6100	2017
## 12627	2017-11-27	1294.70	17.100	75.7135	2017
## 12628	2017-11-28	1293.90	17.070	75.7996	2017
## 12629	2017-11-29	1294.85	16.895	76.6410	2017
## 12630	2017-11-30	1282.15	16.570	77.3778	2017

Select price data for years from 2001 to 2013

```
PriceDataYear_2001_2013 = filter(dataSetsWithPriceRatio, transactionYear %in% c("2001",
"2002", "2003", "2004", "2005", "2006", "2007", "2008", "2009", "2010", "2011", "2012",
"2013"))
tail(PriceDataYear_2001_2013, 20)
```

##	Date	GoldPrice	SilverPrice	PriceRatio	transactionYear
## 3266	2013-12-02	1237.50	19.75	62.6582	2013
## 3267	2013-12-03	1219.00	19.17	63.5889	2013
## 3268	2013-12-04	1213.00	19.05	63.6745	2013
## 3269	2013-12-05	1234.00	19.46	63.4121	2013
## 3270	2013-12-06	1230.75	19.49	63.1478	2013
## 3271	2013-12-09	1228.50	19.50	63.0000	2013
## 3272	2013-12-10	1245.75	20.05	62.1322	2013
## 3273	2013-12-11	1255.25	20.39	61.5620	2013
## 3274	2013-12-12	1243.50	19.80	62.8030	2013
## 3275	2013-12-13	1222.75	19.55	62.5448	2013
## 3276	2013-12-16	1229.50	19.50	63.0513	2013
## 3277	2013-12-17	1237.25	20.02	61.8007	2013
## 3278	2013-12-18	1233.25	19.94	61.8480	2013
## 3279	2013-12-19	1205.25	19.34	62.3190	2013
## 3280	2013-12-20	1195.00	19.33	61.8210	2013
## 3281	2013-12-23	1192.75	19.37	61.5772	2013
## 3282	2013-12-24	1196.50	19.40	61.6753	2013
## 3283	2013-12-27	1209.25	19.92	60.7053	2013
## 3284	2013-12-30	1201.50	19.65	61.1450	2013
## 3285	2013-12-31	1201.50	19.50	61.6154	2013

```
summary(PriceDataYear_2001_2013)
```

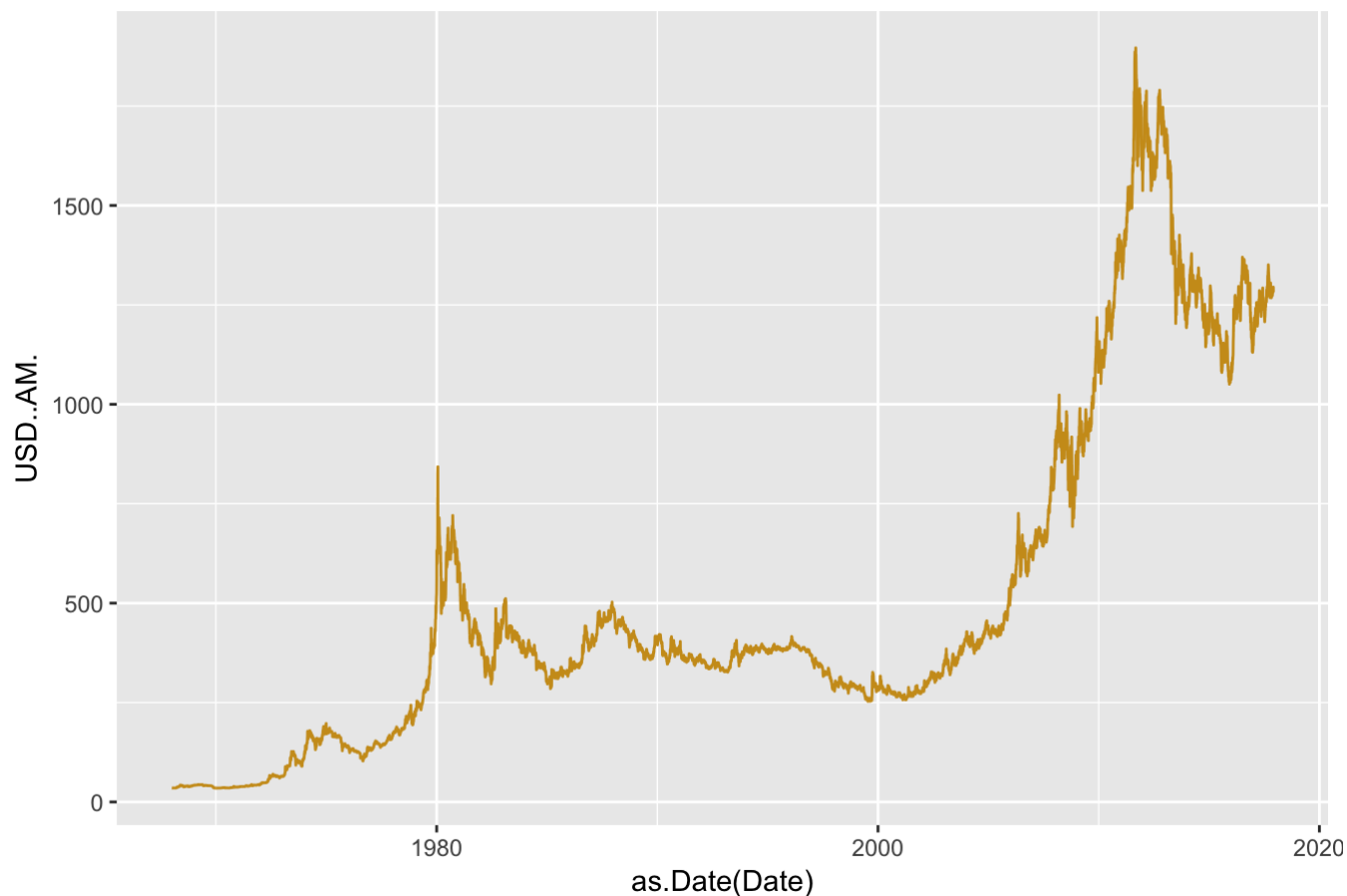
```
##      Date      GoldPrice      SilverPrice      PriceRatio
## Length:3285      Min.       : 256.7      Min.       : 4.065      Min.       :31.44
## Class :character  1st Qu.: 399.3      1st Qu.: 6.200      1st Qu.:53.19
## Mode  :character  Median : 673.6      Median :12.850      Median :60.22
##                               Mean  : 832.2      Mean  :14.807      Mean   :60.04
##                               3rd Qu.:1243.0      3rd Qu.:19.650      3rd Qu.:65.73
##                               Max.   :1896.5      Max.   :48.700      Max.   :83.79
## transactionYear
## Length:3285
## Class :character
## Mode  :character
##
##
##
```

## Data Visualization:

### Gold Price Data

```
ggplot (gold_df, aes(as.Date(Date), USD..AM.)) +
  geom_line (aes(color="Gold")) +
  labs (color="Legend") +
  scale_colour_manual ("", breaks = c("gold"), values = c("goldenrod3")) +
  ggtitle ("Gold Prices") + theme (plot.title = element_text(lineheight=0.7, face="bold"
))
```

## Gold Prices



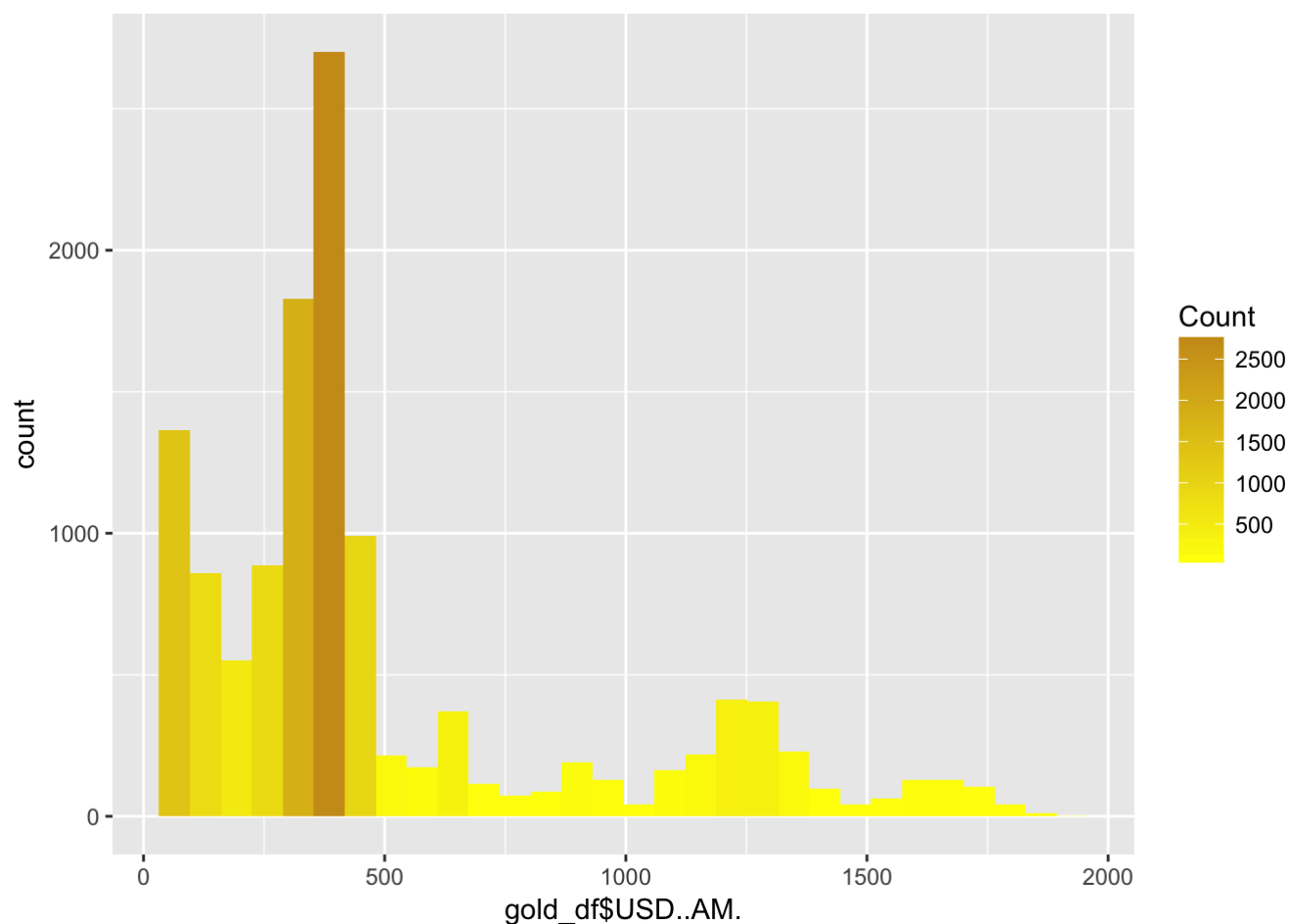
## Gold Price Histogram

```
ggplot(data=gold_df, aes(gold_df$USD..AM.)) +  
  geom_histogram(aes(fill = ..count..)) +  
  scale_fill_gradient("Count", low = "yellow", high = "goldenrod3")
```

```
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```

```
## Warning: Removed 1 rows containing non-finite values (stat_bin).
```

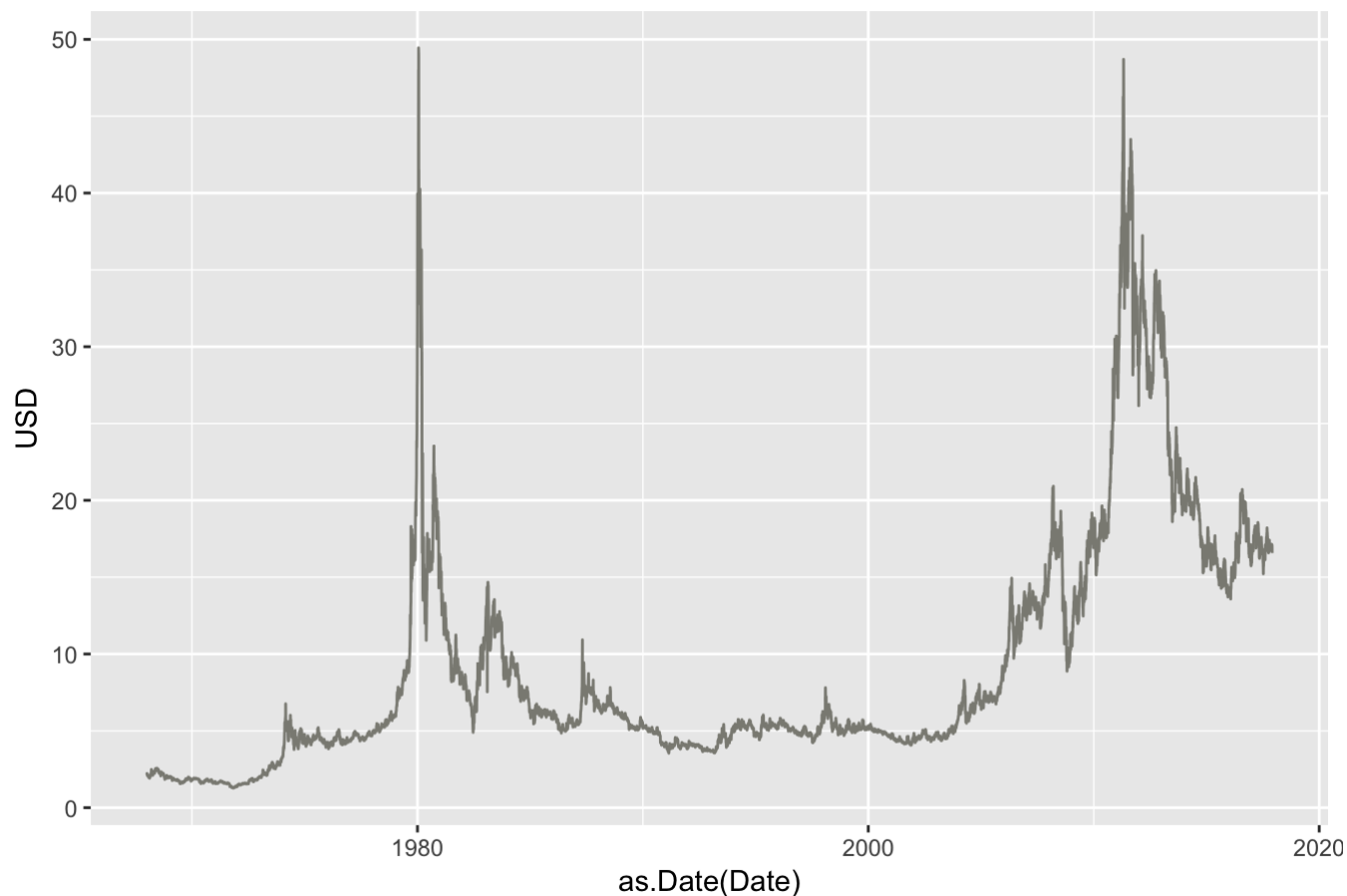




### Silver Price Data

```
ggplot (silver_df, aes(as.Date(Date), USD)) +  
  geom_line (aes(color="Silver")) +  
  labs (color="Legend") +  
  scale_colour_manual ("", breaks = c("silver"), values = c("ivory4")) +  
  ggtitle ("Silver Prices") +  
  theme (plot.title = element_text(lineheight=0.7, face="bold"))
```

## Silver Prices

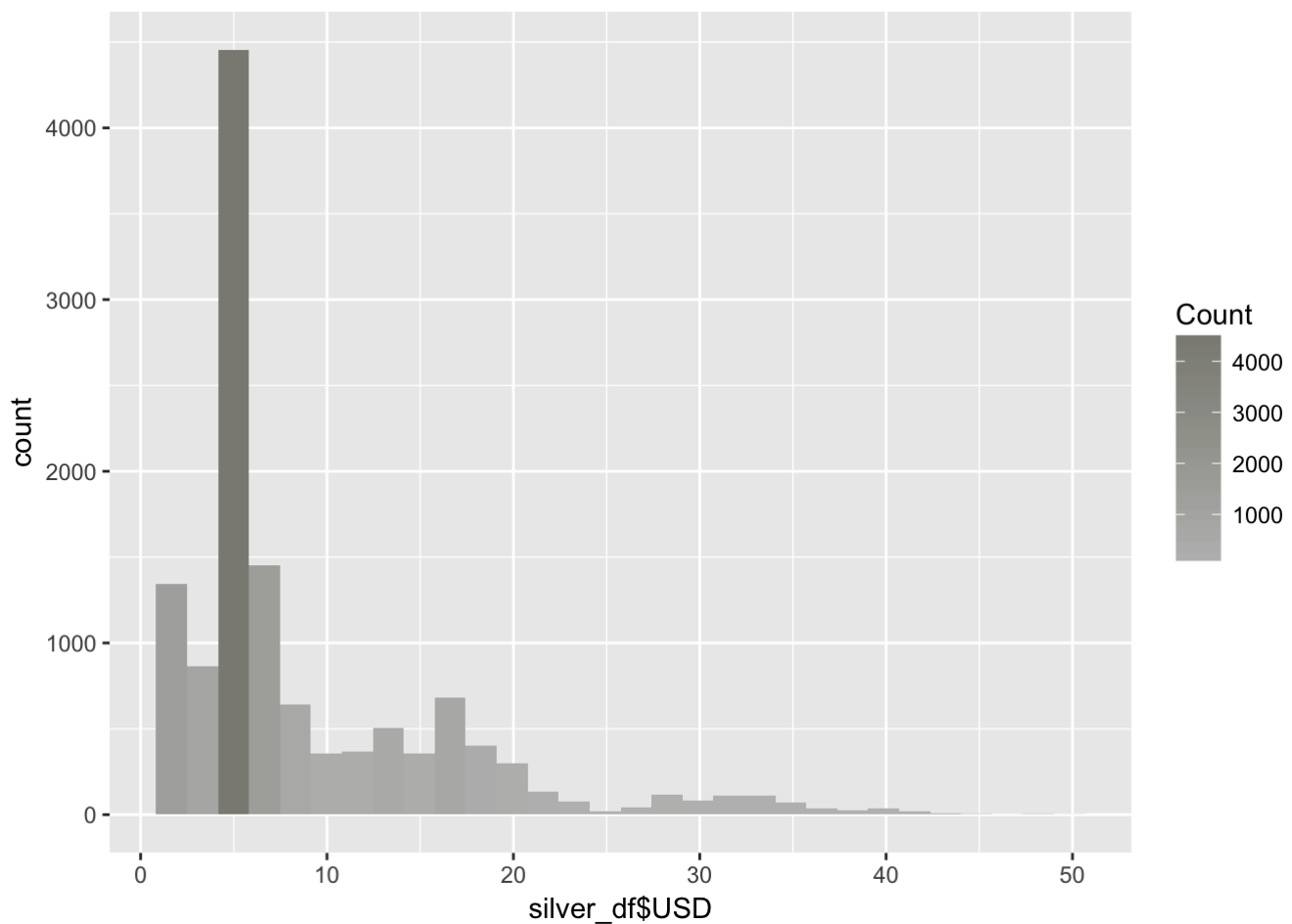


## Silver Price Histogram

```
ggplot(data=silver_df, aes(silver_df$USD)) +  
  geom_histogram(aes(fill = ..count..)) +  
  scale_fill_gradient("Count", low = "grey", high = "ivory4")
```

```
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```

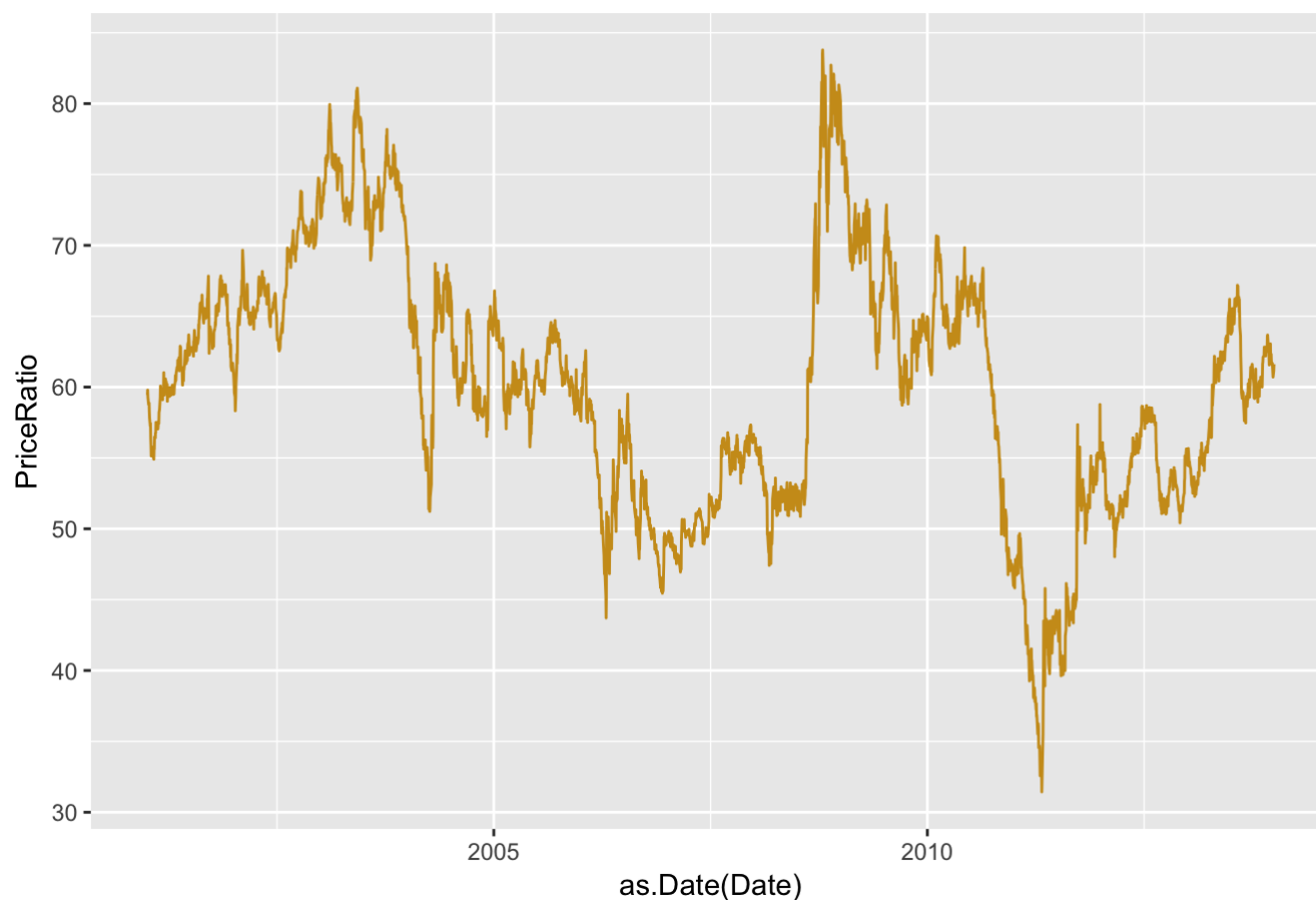
```
## Warning: Removed 19 rows containing non-finite values (stat_bin).
```



### Gold/Silver Price Ratio Data

```
ggplot (PriceDataYear_2001_2013, aes(as.Date(Date), PriceRatio)) +  
  geom_line (aes(color="Blue")) +  
  labs (color="Legend") +  
  scale_colour_manual ("", breaks = c("gold"), values = c("goldenrod3")) +  
  ggtitle ("Gold and Silver Price Ratio") +  
  theme (plot.title = element_text(lineheight=0.7, face="bold"))
```

## Gold and Silver Price Ratio

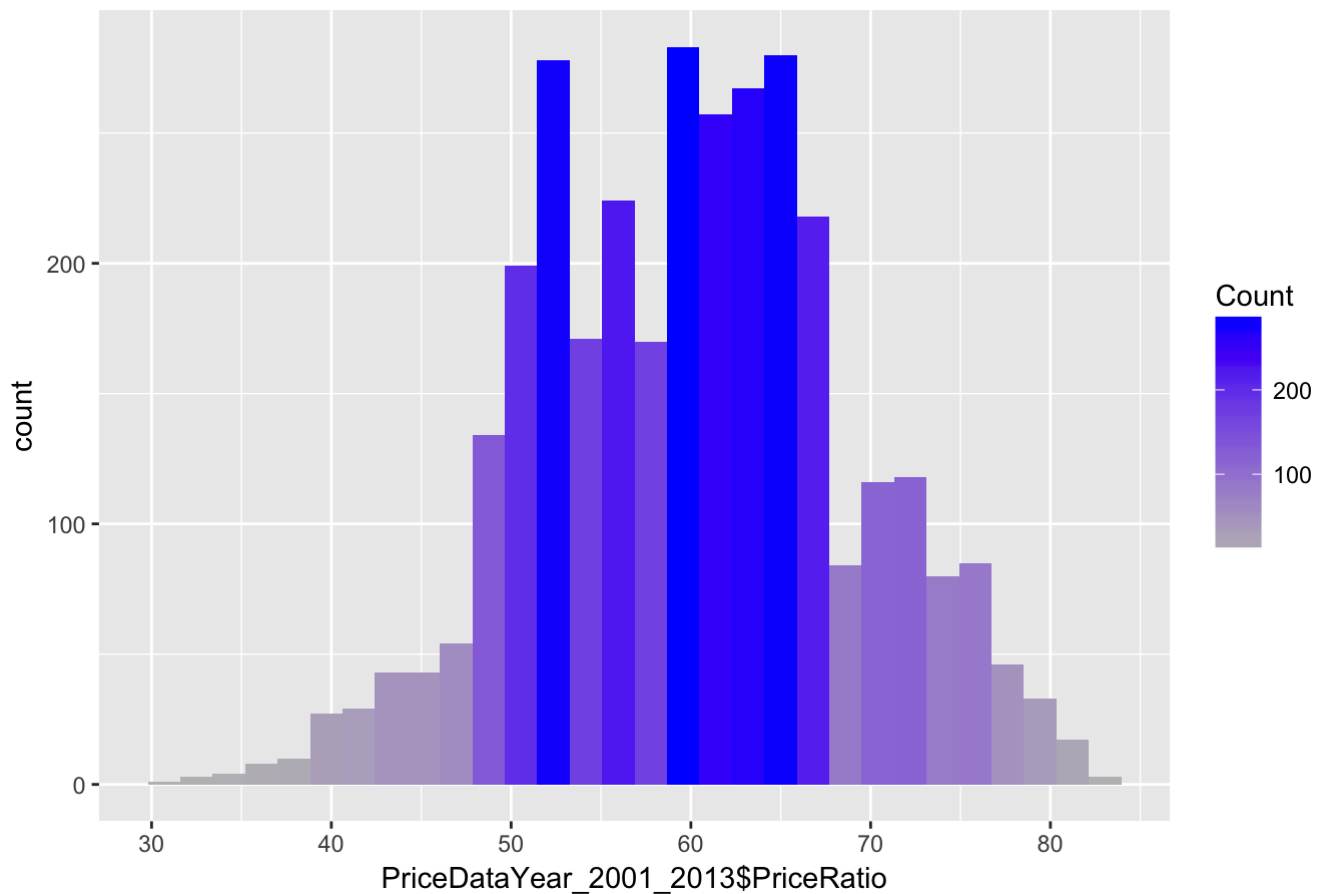


## Gold/Silver Price Ratio Histogram

```
ggplot(data=PriceDataYear_2001_2013, aes(PriceDataYear_2001_2013$PriceRatio)) +  
  geom_histogram(aes(fill = ..count..)) +  
  scale_fill_gradient("Count", low = "grey", high = "blue") +  
  ggtitle ("Gold and Silver Price Ratio Histogram")
```

```
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```

## Gold and Silver Price Ratio Histogram



### Statistical Analysis:

In this section we will create a linear regression model and calculate the correlation between the data to see if there is a strong relationship between silver and gold prices.

#### Create a function to calculate the correlation and round it to 4 decimal digits

```
findCorrelation <- function() {
  x = PriceDataYear_2001_2013$SilverPrice
  y = PriceDataYear_2001_2013$GoldPrice
  corr = round(cor(x, y),4)
  print (paste0("Correlation = ",corr))
  return (corr)
}

c = findCorrelation()
```

```
## [1] "Correlation = 0.9643"
```

#### Create a function for Linear Model

```
findStatsFunction <- function() {
  m = lm (GoldPrice ~ SilverPrice, data = PriceDataYear_2001_2013)
  s = summary(m)
  print(s)

  slp = round(m$coefficients[2], 4)
  int = round(m$coefficients[1], 4)

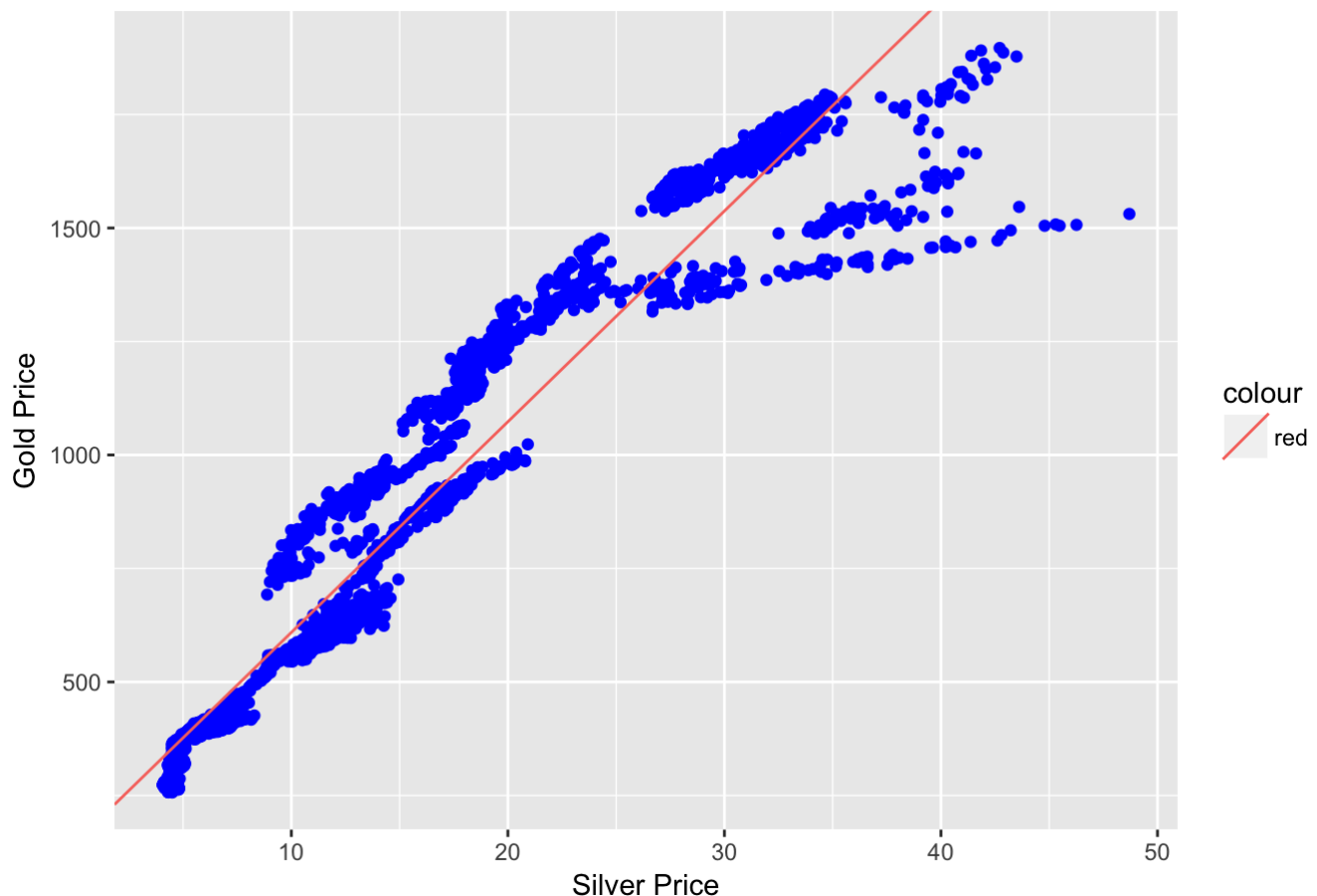
  return (m)
}
m = findStatsFunction()
```

```
##
## Call:
## lm(formula = GoldPrice ~ SilverPrice, data = PriceDataYear_2001_2013)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -874.17  -63.04  -28.61   100.34   263.92
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  144.9725     3.9801   36.42  <2e-16 ***
## SilverPrice   46.4107     0.2224  208.64  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 128.1 on 3283 degrees of freedom
## Multiple R-squared:  0.9299, Adjusted R-squared:  0.9298
## F-statistic: 4.353e+04 on 1 and 3283 DF,  p-value: < 2.2e-16
```

## Display the Linear Model

```
plot = ggplot(PriceDataYear_2001_2013, aes(SilverPrice, GoldPrice)) + geom_point(colour="blue") +
  xlab("Silver Price") + ylab("Gold Price") + labs(title = "Gold Price vs Silver Price") +
  geom_abline(aes(slope=round(m$coefficients[2], 4), intercept=round(m$coefficients[1], 4), color="red"))
print(plot)
```

## Gold Price vs Silver Price



### Regression Statistics

Linear Regression Equation:  $\text{goldPrice} = 144.9725 + (46.4107 * \text{silverPrice})$  Correlation Coefficient: 0.9643  
Multiple R-Square: 0.9299 Adjusted R-Square: 0.9298 Description: Strong correlation. Model fits the data

### Hypothesis Testing

H<sub>0</sub> : Null Hypothesis: There is no relationship between silver and gold prices  
H<sub>A</sub> : Alternative Hypothesis: There is a relationship between silver and gold prices

The multiple R value is 0.9299 which indicates that there is significant correlation between silver and gold prices. The value of Adjusted R square is 0.9298 which also indicates that silver price affects the gold price. Therefore, we reject the null hypothesis (H<sub>0</sub>) and accept the Alternative hypothesis (H<sub>1</sub>).

### Conclusion:

The two variables (silver price and gold Price) change in the same direction. If the silver price increases the gold price increases as well. Therefore, there is a positive correlation of 0.9641 between the two variables. Also, from the linear regression model, we can reject the null hypothesis and accept the alternative hypothesis. In conclusion, there is a strong relationship between silver and gold prices for the 13 year period of study (2001-2013).

End of this project file