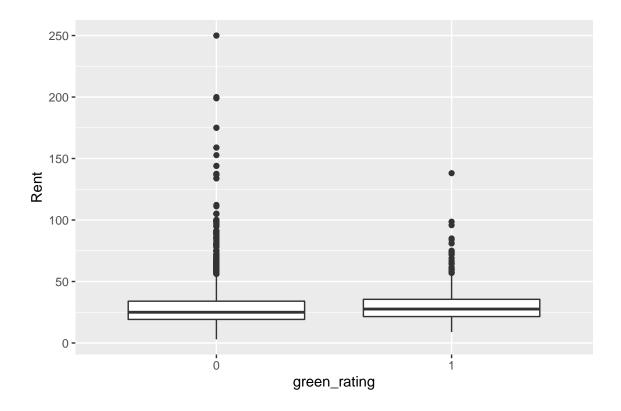
Exercise

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08/16/20

Visual story telling: green buildings

It does make sense to use the median rather than mean as the non-green buildings have many outliers as suggested by the boxplot below



The stats guru is right about removing buildings with less than 10% occupancy as based on the summary below. Within the group of buildings that have only 10% occupancy, there is only one building with a green rating. In addition, roughly half of the buildings have 3 stories and very few buildings have a Class A designation. Hence we should remove buildings with less than 10% occupancy as it may distort the analysis.

##	CS_PropertyID			cluster			size			${\tt empl_gr}$		
##	Min.	:	57	Min.	:	8.0	Min.	:	1624	Min.	:	-1.490
##	1st Qu	. :	239800	1st Qu.	:	256.0	1st Qu	. :	11661	1st Qu	. :	1.740
##	Median	:	393481	Median	:	371.0	Median	:	40000	Median	:	2.300
##	Mean	: 1	.084028	Mean	:	536.2	Mean	:	62209	Mean	:	3.884

```
3rd Qu.: 819966
                       3rd Qu.:1002.0
                                          3rd Qu.: 83770
                                                            3rd Qu.: 3.700
            :6008486
                                                                    :67.780
##
    Max.
                       Max.
                               :1230.0
                                         Max.
                                                 :427383
                                                            Max.
##
                                                            NA's
                                                                    :1
##
         Rent
                       leasing_rate
                                           stories
                                                               age
                                                                            renovated
##
    Min.
           :
              7.00
                      Min.
                              :0.000
                                       Min.
                                               : 1.000
                                                          Min.
                                                                  :
                                                                    0.00
                                                                            0:148
    1st Qu.: 16.23
                      1st Qu.:0.000
                                       1st Qu.: 2.000
                                                          1st Qu.: 28.00
                                                                            1: 67
##
                      Median : 0.000
##
    Median : 20.50
                                       Median : 3.000
                                                          Median: 57.00
##
    Mean
           : 22.44
                      Mean
                              :1.280
                                       Mean
                                               : 4.819
                                                          Mean
                                                                  : 54.42
##
    3rd Qu.: 27.00
                      3rd Qu.:0.375
                                       3rd Qu.: 6.000
                                                          3rd Qu.: 85.00
##
    Max.
           :111.11
                      Max.
                              :9.780
                                       Max.
                                               :19.000
                                                          Max.
                                                                  :118.00
##
                                    LEED
##
    class_a
                class_b
                                              Energystar
                                                                green_rating
##
    0:193
                    :0.0000
                                       :0
                                                    :0.000000
                                                                0:214
            Min.
                               Min.
                                            Min.
                                                                1: 1
##
    1: 22
             1st Qu.:0.0000
                               1st Qu.:0
                                            1st Qu.:0.000000
##
             Median :0.0000
                               Median:0
                                            Median :0.000000
##
             Mean
                    :0.4884
                               Mean
                                       :0
                                            Mean
                                                    :0.004651
##
             3rd Qu.:1.0000
                               3rd Qu.:0
                                            3rd Qu.:0.000000
##
                    :1.0000
                               Max.
                                       :0
                                                   :1.000000
             Max.
                                            Max.
##
##
         net.
                        amenities cd total 07
                                                     hd total07
                                                                     total dd 07
##
    Min.
            :0.000000
                        0:189
                                   Min.
                                           : 130
                                                               0
                                                                   Min.
                                                                           :2103
                                                   Min.
    1st Qu.:0.000000
                        1: 26
                                   1st Qu.: 684
                                                                    1st Qu.:2869
##
                                                   1st Qu.:1419
    Median :0.000000
                                   Median :1113
##
                                                   Median:2472
                                                                   Median:4854
##
    Mean
            :0.004651
                                   Mean
                                           :1676
                                                   Mean
                                                           :3141
                                                                   Mean
                                                                           :4816
##
    3rd Qu.:0.000000
                                   3rd Qu.:2746
                                                   3rd Qu.:4916
                                                                    3rd Qu.:6546
##
    Max.
           :1.000000
                                   Max.
                                           :5240
                                                   Max.
                                                           :7200
                                                                    Max.
                                                                           :8244
##
##
    Precipitation
                       Gas_Costs
                                          Electricity_Costs
                                                              cluster_rent
##
            :10.46
                             :0.009487
                                                 :0.01782
   \mathtt{Min}.
                                          Min.
                                                             Min.
                                                                     :10.22
##
    1st Qu.:22.71
                     1st Qu.:0.010118
                                          1st Qu.:0.02453
                                                             1st Qu.:18.05
##
    Median :25.55
                     Median :0.010296
                                          Median: 0.02887
                                                             Median :20.74
##
    Mean
            :30.34
                     Mean
                             :0.011579
                                          Mean
                                                 :0.03111
                                                             Mean
                                                                     :23.99
##
    3rd Qu.:41.32
                     3rd Qu.:0.012117
                                          3rd Qu.:0.03781
                                                             3rd Qu.:27.02
            :58.02
                             :0.028914
##
    Max.
                                                 :0.06278
                                                                     :65.94
                     Max.
                                          Max.
                                                             Max.
##
```

The median rent for green buildings and non-green buildings is correct if buildings with more than 10% occupancy rate are considered.

```
## 'summarise()' ungrouping output (override with '.groups' argument)
```

Assuming that the building is 250000 square feet, it seems that the stats guru is correct about recuperating the costs in a little under 8 years.

Confounding variables investigation

Renovated Buildings

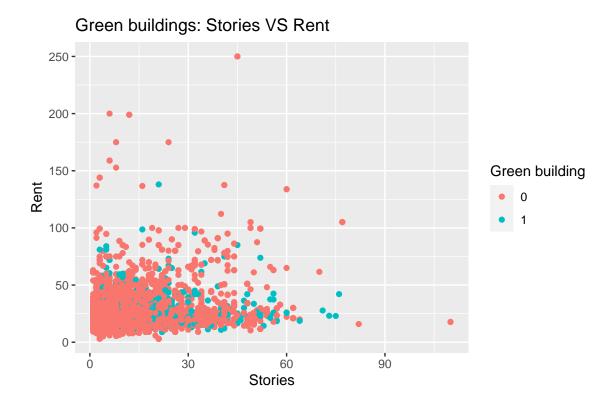
Based on the numerical summary analysis for buildings that are renovated, it does not seem there is much

confounding going on as the median rents for non renovated and renovated buildings are similar especially for green buildings

```
'summarise()' regrouping output by 'renovated' (override with '.groups' argument)
  # A tibble: 4 x 3
  # Groups:
               renovated [2]
     renovated green_rating MedianRent
               <fct>
## 1 0
                                   27
                                   27.6
## 2 0
               1
               0
## 3 1
                                   23.5
## 4 1
               1
                                   27.0
   'summarise()' ungrouping output (override with '.groups' argument)
  # A tibble: 2 x 2
##
     renovated MedianRent
##
     <fct>
                    <dbl>
##
## 1 0
                     27
## 2 1
                     23.8
```

Number of Stories

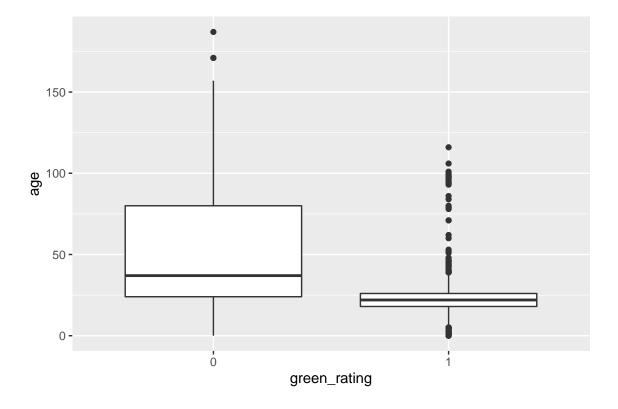
As suggested by the plot below, the median for stories is a valid selection since there are some outliers. It looks there is not much evidence of confounding for the number of stories in the building, even though there is a slight increase in rent as the number of stories goes up. The median for stories of green buildings only differs by 1, so stories may not directly be affecting the rent.



'summarise()' ungrouping output (override with '.groups' argument)

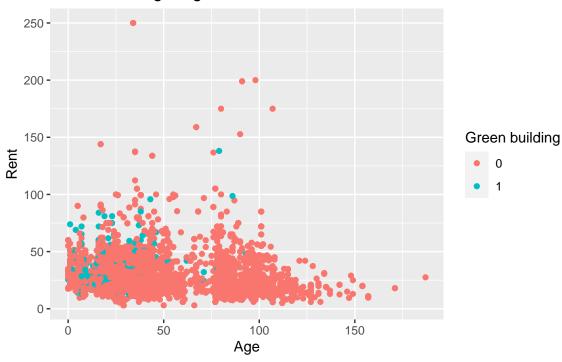
Age

An initial analysis provides a stark contrast in age between green and non-green buildings.



However, it looks like there is no confounding for age, as there is no correlation between the age of the building and the rent from the plot below.

Green buildings: Age VS Rent



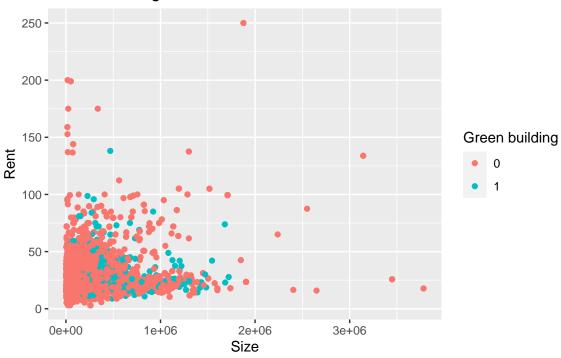
'summarise()' ungrouping output (override with '.groups' argument)

Size

It looks like size is definitely a confounding variable, as size is correlated with rent from plot below and the median size for green buildings is double that of non-green. Thus, there is a premium in rent for larger sizes, as expected.

'summarise()' ungrouping output (override with '.groups' argument)

Green buildings: size VS Rent



Cluster Rent

There does not seem to be confounding for cluster rent, as the median for cluster rent is approximately the same between green and non-green buildings. However, cluster rent is highly correlated with the rent of the building.

```
## 'summarise()' ungrouping output (override with '.groups' argument)
```

```
## # A tibble: 2 x 2
## c green_rating MedianClusterRent
## c <fct> <dbl>
## 1 0 25.2
## 2 1
```

Green buildings: Cluster rent VS Rent

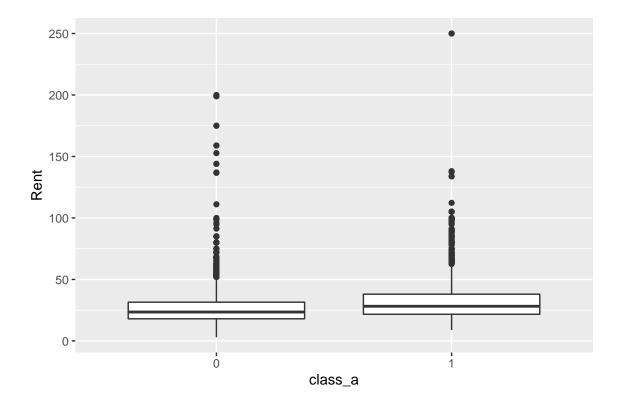


Class

It looks like the Class designation of buildings is a confounding variable, as Class A buildings have generally higher median rents - in addition, having a green_rating with the Class A designation drives median rents even higher. Class A designated buildings seem to correlate with overall rent as well.

'summarise()' regrouping output by 'class_a' (override with '.groups' argument)

```
##
   # A tibble: 4 x 3
   # Groups:
                class_a [2]
##
     class_a green_rating MedianRent
     <fct>
              <fct>
##
                                 <dbl>
## 1 0
              0
                                  23.6
## 2 0
              1
                                  25.7
              0
                                  28.2
## 3 1
## 4 1
              1
                                  28.4
```



'summarise()' ungrouping output (override with '.groups' argument)

```
## # A tibble: 2 x 2
## class_a MedianRent
## <fct> <dbl>
## 1 0 23.9
## 2 1 28.2
```

Thoughts

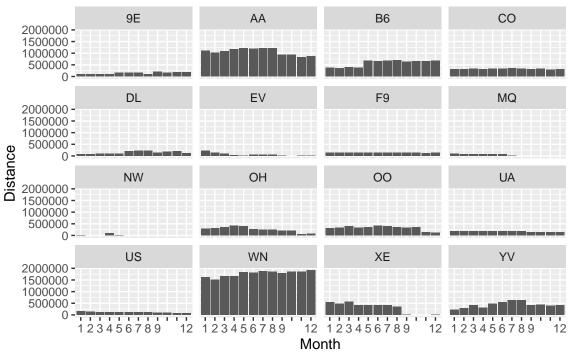
From the investigation above it seems like size and class are the only confounding variables, as the green buildings tend to have larger spaces and larger spaces have higher rent. However, the stats guru is only taking into account the median rent of all the building with more than 10% occupancy. If we apply another filter to include only 15 story buildings, we see that the rent goes up drastically for green buildings - all the way to 37 dollars. However, it may not be wise to use this filter as there is only 10 green buildings that have 15 stories.

```
## 'summarise()' ungrouping output (override with '.groups' argument)
```

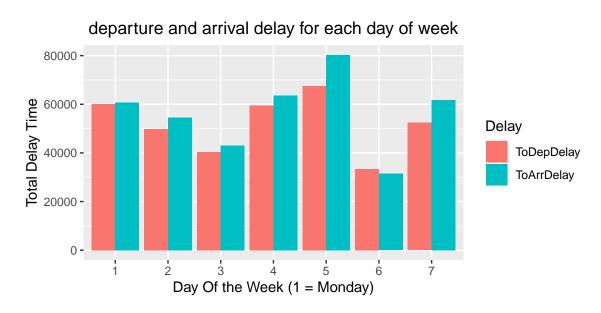
In general, the guru is correct with his analysis, but the analysis is performed on a dataset with a large range of different building specifications. For example, the dataset only contains 10 green buildings that have 15 stories. A larger sample size that adheres to the developers desired specs would provide more valid results. ## Visual story telling: flights at ABIA

Here we analyze which airlines are most active throughout the year in terms of the distance flown. As seen by the plot, it appears Southwest (WN) and American Airlines(AA) are the most active in flying out of ABIA and flying to ABIA.



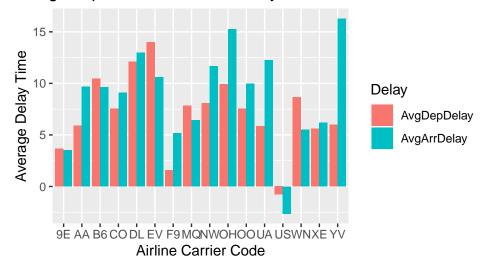


In this plot, we analyze the departure and arrival delay for each day of the week. There are more arrival delays than departure delays and Friday is the worst day to travel to/from Austin.



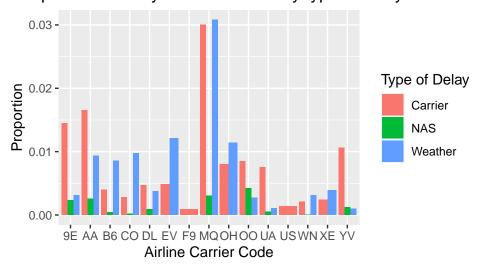
This plot analyzes the average departure and arrival delay for each airline. It looks like Piedmont Airlines (US) arrives and departs early on average as the delay time is negative.

Average departure and arrival delay for each airline

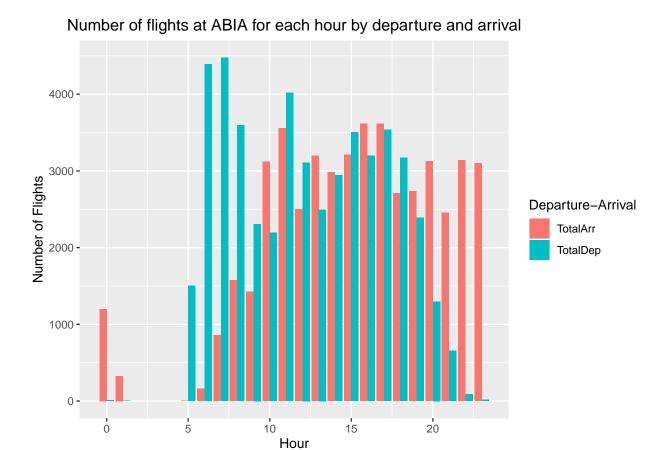


Here we analyze the proportions of delays by airlines via the type of delay. It look like most airlines suffer from carrier and weather delays.

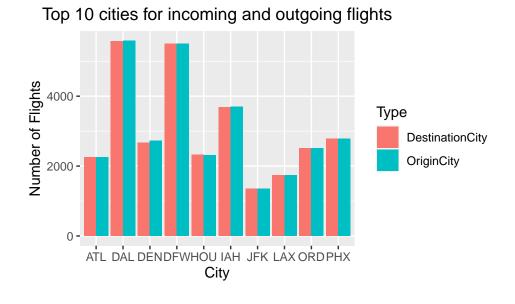
Proportion of delay for each airline by type of delay



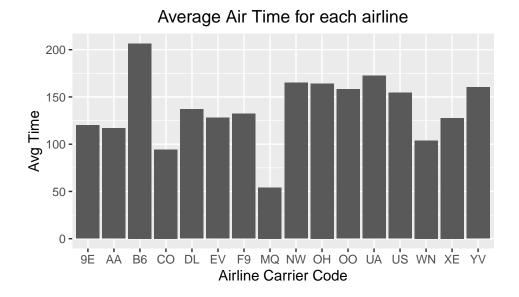
The plot below analyzes what are most frequent departure and arrival times. Passengers typically fly out early in the morning and fly in late at night. Between noon and evening there is an even split between passengers flying in and out.



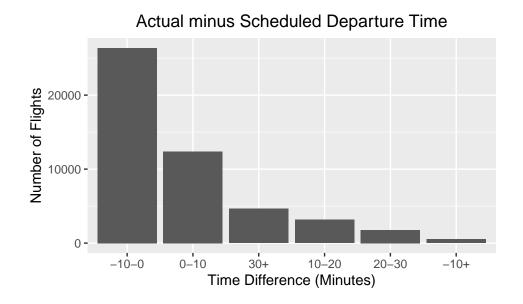
The plot below analyzes the top ten airports to which passengers fly to and fly in from. Dallas and Houston are by far the most popular destinations.



The plot below analyzes the average time spent flying for each airline. JetBlue (B6) flies for more than 3 hours on average.



The plot below analyzes on average how often an airline deviates from its scheduled departure time. Most airlines leave between 0 to 10 minutes earlier than scheduled!



Portfolio modeling

For this problem, we are analyzing five different ETFs ranging from Gold ETFs to Oil related ETFs.

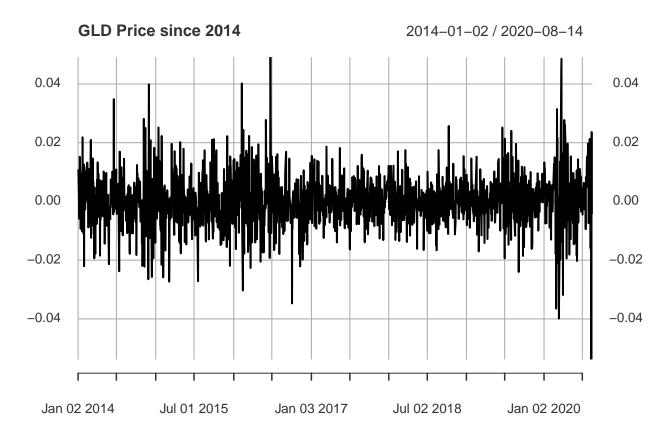
We have chosen to go with 5 ETFs:

"GLD" - The Fund seeks to achieve the performance of gold bullion less the expenses of the Fund

"USO" - The Fund seeks to reflect the performance of the spot price of West Texas Intermediate light, sweet crude oil delivered to Cushing, Oklahoma by investing in a mix of Oil Futures Contracts and Other Oil Interests.

"VNQ" - The Fund seeks to provide a high level of income and moderate long-term capital appreciation by tracking the performance of a benchmark index that measures the performance of publicly traded equity REITs and other real estate-related investments.

Simulate how volatile each ETF is. Looks like oil ETFs are the most volatile of the five chosen

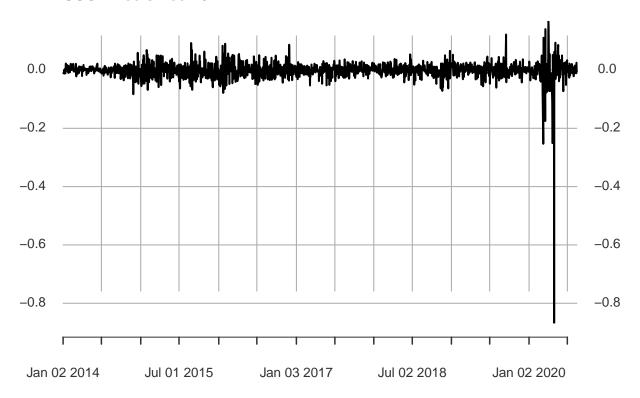


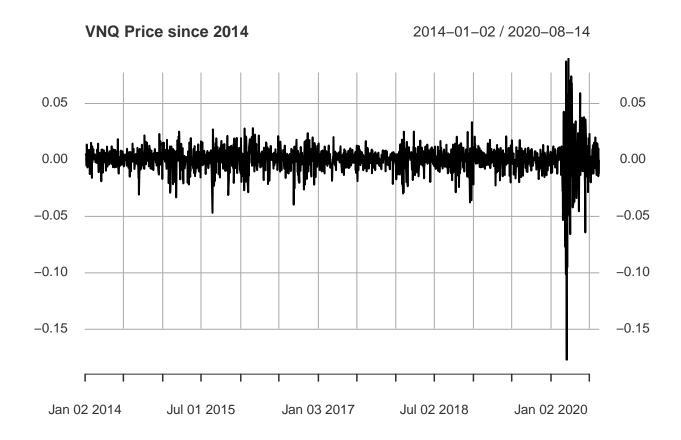
[&]quot;BNO" - BNO tracks the Brent oil spot price using near-month ICE futures contracts.

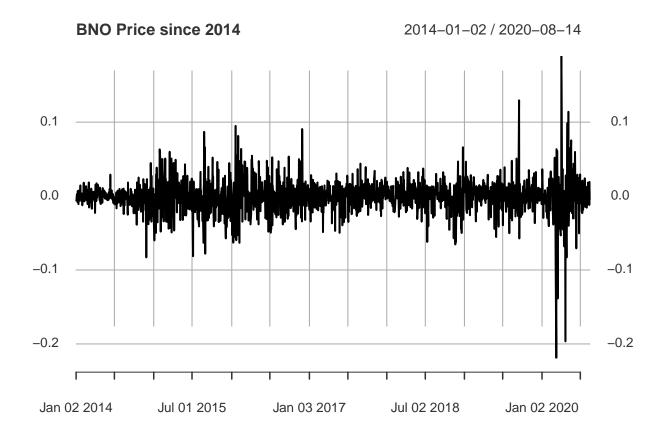
[&]quot;SLV" - The Fund seeks to reflect generally the performance of the price of silver.

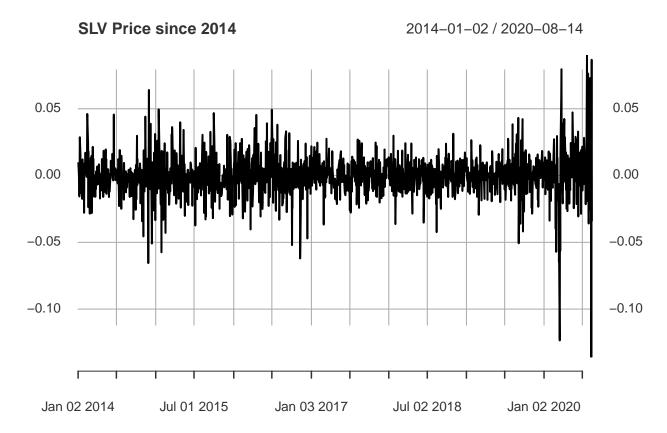


2014-01-02 / 2020-08-14



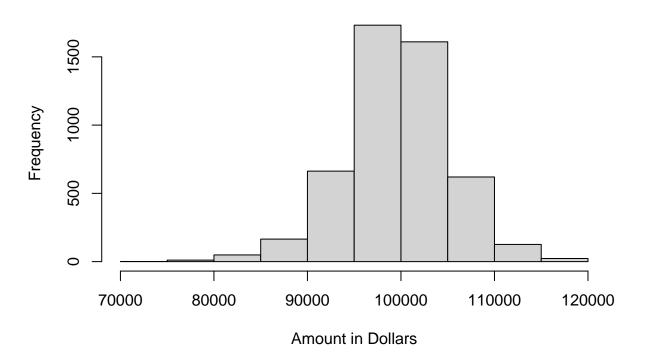




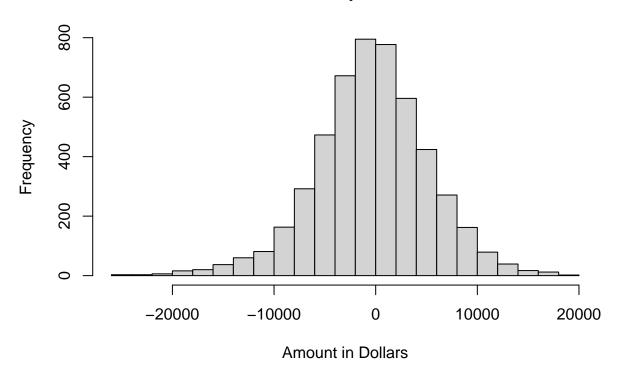


Portfolio 1 : Equal weights to all ETFs (i.e 20 percent to all) It looks like our 5% value at risk is around 9674

Portfolio 1 Returns



Portfolio 1 profit/loss

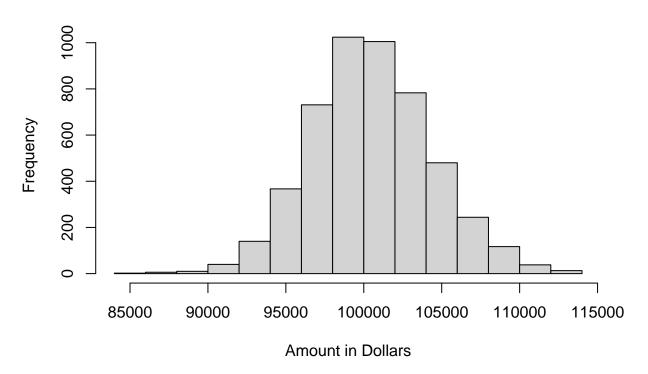


5% ## 9673.958

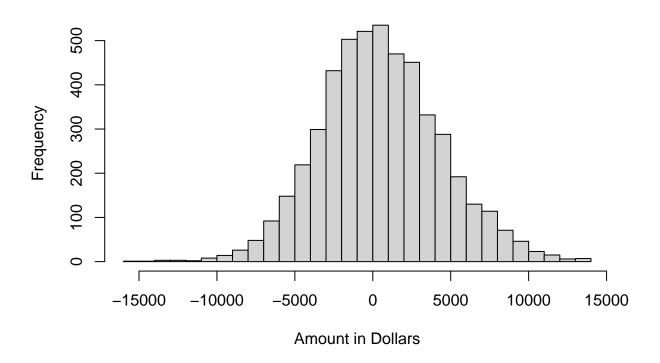
[1] 99608.35

Portfolio 2 : Invest 96 percent of wealth into gold and 1 percent each into the remaining 4 ETFs. It looks like our 5% value at risk is around 5670

Portfolio 2 Returns



Portfolio 2 profit/loss

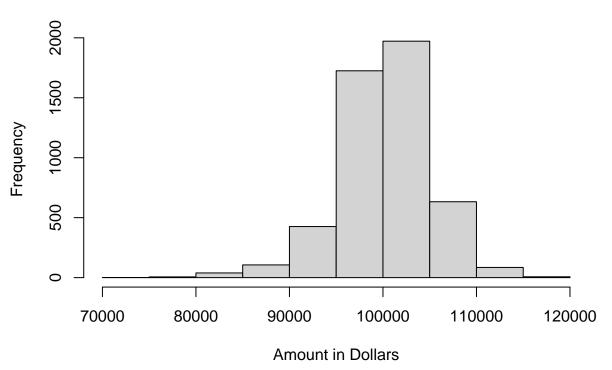


5% ## 5670.255

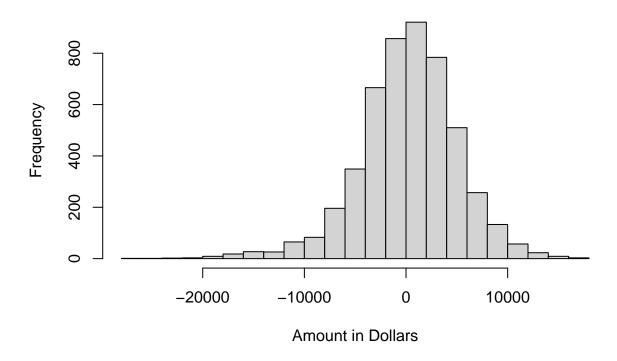
[1] 100490.9

Portfolio 3 : Invest 60 percent of wealth into VNQ and 10 percent each into the remaining 4 ETFs. It looks like our 5% value at risk is around 7695

Portfolio 3 Returns



Portfolio 3 profit/loss



5% ## 7694.568

[1] 100226.4

Report

Based on our analysis, it looks like portfolio 2 performed the best where basically all of our investment went into gold. The portfolio had the highest returns and the lowest value at risk at 5%. This is an interesting result as diversification of the portfolio hurt our investments which suggests that ETFs related to Oil and Silver are significantly more volatile than Gold. This also suggests that Gold is typically a safe investment to make.