Assignment_5_Solution

April 20, 2022

0.1 Problem 1 (100 points)

In this assignment, you will backtest the "momentum" strategy which involves going long on stocks with the highest returns in the past 12 months and shorting the stocks with the lowest returns in the past 12 months, and rebalancing these portfolios every month. Please follow the steps below to implement this backtest:

- **Data** $(10 \times 2 = 20 \text{ points})$
 - 1. Load the "crspm.zip" file into a dataframe called crsp. Create a new variable called mdate which converts the date variable into a monthly period date. Calculate market capitalization (mktcap) as number of shares outstanding (shrout) times the absolute value of price (prc). Create a new variable mktcap_lag1 that, for each firm, each month, equals the market capitalization (mktcap) of that firm in the previous month (assume no duplicates or gaps in the data, i.e. use the shift() method for lagging). Keep only permno, mdate, ret, mktcap_lag1, and drop all rows that have any missing values in any of those variables. Print the first five and last five rows of the resulting dataset.
 - 2. Create a new variable called ret11 which, for each firm, each month, equals the net compounded returns of the firm in the past 12 months, excluding the current month (e.g. for December 2010, ret11 equals the compounded returns from Jan 2010 to Nov 2010). Print a table that gives us the mean and standard deviation of ret and ret11.

• Momentum portfolios ($10 \times 4 = 40 \text{ points}$)

- 3. Drop all rows for which ret11 is missing. Then, create a variable called ret11_decile which, every month, tells us how each firm ranks (which decile) amongst all other firms with respect to their past 11-month returns (ret). Firms in decile 1 will form portfolio 1, firms in decile 2 for portfolio 2, etc. Print out a table that tells us how many observations you have for each decile in your dataset.
- 4. These portfolios are held for one month, and then they are re-created again (rebalanced) based on the new values of ret11 for the current month. For this reason, the return of a portfolio (decile) in a given month is based on which firms were in that decile in the previous month. To help with this (for steps 5 and 6 below), create a new variable called portf_nr which equals the ret11_decile that the firm was in the previous month. Print out a table that tells us how many observations you have for each portf_nr in your dataset.
- 5. Calculate the monthly equal-weighted (EW) returns of each of the 10 portfolios. Calculate the EW returns to the momentum strategy by subtracting returns of portfolio 1 from the returns of portfolio 10. This will be referred to as the "spread portfolio" below.

- Store these returns in a new dataframe called ew_ret and print the first 5 and last 5 rows of this dataframe.
- 6. Repeat step 5 using value-weighted (VW) returns. Use mktcap_lag1 (i.e. the market capitalization at the end of the prior month) as weights. Store these returns in a new dataframe called vw_ret and print the first 5 and last 5 rows of this dataframe.
- Analysis ($10 \times 4 = 40 \text{ points}$)
 - 7. Calculate and print the average EW returns for the 10 momentum portfolios as well as the spread portfolio.
 - This should be a 11-by-1 table containing the EW averages
 - 8. Calculate and print the average VW returns for the 10 momentum portfolios as well as the spread portfolio.
 - This should be a 11-by-1 table containing the VW averages
 - 9. Calculate and print risk-adjusted average EW returns (with respect to the Fama-French three-factor model) and their t-statistics for the 10 momentum portfolios as well as the spread portfolio
 - This should be an 11-by-2 table
 - The numbers in this table are "alpha" coefficients from regressing each portfolio's EW returns on the Fama-French three factors (in the first column) and the tstats of these coefficients (in the second column)
 - 10. Calculate and print risk-adjusted average VW returns (with respect to the Fama-French three-factor model) and their t-statistics for the 10 momentum portfolios as well as the spread portfolio
 - This should be an 11-by-2 table
 - The numbers in this table are "alpha" coefficients from regressing each portfolio's VW returns on the Fama-French three factors (in the first column) and the tstats of these coefficients (in the second column)

Output for part 1:

	permno	mdate	ret	mktcap_lag1
1	10000.0	1986-02	-0.257143	1.610000e+04
2	10000.0	1986-03	0.365385	1.196000e+04
3	10000.0	1986-04	-0.098592	1.633000e+04
4	10000.0	1986-05	-0.222656	1.517200e+04
5	10000.0	1986-06	-0.005025	1.179386e+04
•••	•••			•••
2553248	93436.0	2020-08	0.741452	2.666393e+08
2553249	93436.0	2020-09	-0.139087	4.643391e+08
2553250	93436.0	2020-10	-0.095499	4.067015e+08
2553251	93436.0	2020-11	0.462736	3.678235e+08
2553252	93436.0	2020-12	0.243252	5.380286e+08

[2525383 rows x 4 columns]

Output for part 2:

```
mean 0.011656
               0.129892
std
      0.191348 0.748724
Output for part 3:
1
      229084
2
      228849
3
      228808
4
      228850
5
      228905
6
      228749
7
      228803
8
      228855
9
      228802
10
      229044
Name: ret11_decile, dtype: int64
Output for part 4:
1
      223833
2
      227185
3
      227532
4
      227730
5
      227686
6
      227477
7
      227315
8
      226930
9
      226293
10
      225875
Name: portf_nr, dtype: int64
Output for part 5:
                          2
portf_nr
                                    3
                                                       5
                                                                 6 \
mdate
1981-01
               NaN
                        NaN
                                  {\tt NaN}
                                           {\tt NaN}
                                                     NaN
                                                               NaN
                            0.011000 0.010897
1981-02 -0.001611 0.018650
                                                0.012980 0.016318
1981-03
          0.073697
                   0.070473
                             0.080238
                                      0.082625
                                                0.071313
                                                          0.074025
                             0.020516
                                                0.029836
1981-04
          0.033108 0.024192
                                      0.029522
                                                          0.027749
1981-05
          0.010310
                   0.011268 0.016465
                                      0.013602
                                                0.026789
                                                          0.028721
            •••
                                                   •••
          0.058369 0.050536 0.066951
                                                0.053586 0.043611
2020-08
                                      0.054317
2020-09 -0.073705 -0.038189 -0.035999 -0.023008 -0.031162 -0.018343
                                                0.014210 0.003614
2020-10 -0.012347 0.030453 0.046157
                                      0.028848
2020-11
          0.404211
                   0.242672 0.194575
                                      0.185290
                                                0.168104 0.167673
2020-12
```

ret

ret11

```
7
                            8
                                             9
portf_nr
                                                       10
                                                               Spread
mdate
1981-01
                  {\tt NaN}
                              {\tt NaN}
                                          NaN
                                                       NaN
                                                                   NaN
1981-02
            0.008814 \quad 0.007066 \quad 0.003615 \quad -0.017493 \quad -0.015882
1981-03
            0.068516 \quad 0.069465 \quad 0.087356 \quad 0.079740 \quad 0.006043
1981-04
            0.028870 \quad 0.029622 \quad 0.038376 \quad 0.031609 \quad -0.001499
1981-05
            0.026589 \quad 0.022504 \quad 0.055683 \quad 0.055878 \quad 0.045568
2020-08
            0.035730 0.041590 0.032555 0.037719 -0.020650
2020-09 -0.023794 -0.023569 -0.012108 0.007355 0.081060
2020-10
            0.018308 \quad 0.009093 \quad 0.010959 \quad -0.025737 \quad -0.013390
2020-11
            0.145358 \quad 0.165401 \quad 0.165987 \quad 0.216825 \quad -0.187386
2020-12
            0.080126  0.072444  0.099552  0.074695 -0.086260
```

[480 rows x 11 columns]

Output for part 6:

portf_nr	1	2	3	4	5	6	\
mdate							
1981-01	NaN	NaN	NaN	NaN	NaN	NaN	
1981-02	-0.007998	0.034823	0.032598	0.011224	0.025033	0.030649	
1981-03	0.143031	0.085449	0.044863	0.033512	0.048550	0.023256	
1981-04	-0.011028	-0.010393	0.023165	-0.015613	-0.008582	-0.021044	
1981-05	-0.005517	0.030109	-0.009834	0.004325	0.017044	0.002600	
•••	•••	•••		•••	•••		
2020-08	0.042744	0.060993	0.055256	0.039988	0.063935	0.040496	
2020-09	-0.076537	-0.069751	-0.054620	-0.044092	-0.025421	-0.009056	
2020-10	-0.045062	0.015458	0.030485	0.013707	-0.003825	-0.031272	
2020-11	0.373683	0.275725	0.219271	0.179983	0.143367	0.128766	
2020-12	0.088073	0.065939	0.065340	0.058779	0.067205	0.030568	
portf_nr	7	8	9	10	Spread		
<pre>portf_nr mdate</pre>	7	8	9	10	Spread		
-	7 NaN	8 NaN	9 NaN	10 NaN	Spread NaN		
mdate			NaN		-		
mdate 1981-01	NaN	NaN	NaN	NaN -0.001883	NaN		
mdate 1981-01 1981-02	NaN 0.031447 0.034338	NaN 0.000641	NaN 0.024081 0.060206	NaN -0.001883 0.090606	NaN 0.006115		
mdate 1981-01 1981-02 1981-03	NaN 0.031447 0.034338	NaN 0.000641 0.043392	NaN 0.024081 0.060206	NaN -0.001883 0.090606	NaN 0.006115 -0.052425		
mdate 1981-01 1981-02 1981-03 1981-04	NaN 0.031447 0.034338 -0.017775	NaN 0.000641 0.043392 -0.029303	NaN 0.024081 0.060206 -0.002552	NaN -0.001883 0.090606 -0.003691	NaN 0.006115 -0.052425 0.007337		
mdate 1981-01 1981-02 1981-03 1981-04	NaN 0.031447 0.034338 -0.017775	NaN 0.000641 0.043392 -0.029303	NaN 0.024081 0.060206 -0.002552 0.035657	NaN -0.001883 0.090606 -0.003691	NaN 0.006115 -0.052425 0.007337		
mdate 1981-01 1981-02 1981-03 1981-04 1981-05 	NaN 0.031447 0.034338 -0.017775 0.000368 	NaN 0.000641 0.043392 -0.029303 0.020718 	NaN 0.024081 0.060206 -0.002552 0.035657 	NaN -0.001883 0.090606 -0.003691 0.062959 	NaN 0.006115 -0.052425 0.007337 0.068476		
mdate 1981-01 1981-02 1981-03 1981-04 1981-05 2020-08	NaN 0.031447 0.034338 -0.017775 0.000368 0.050129 -0.020338	NaN 0.000641 0.043392 -0.029303 0.020718 0.071553	NaN 0.024081 0.060206 -0.002552 0.035657 0.076713 -0.042851	NaN -0.001883 0.090606 -0.003691 0.062959 0.165289 -0.066764	NaN 0.006115 -0.052425 0.007337 0.068476 0.122546 0.009772		
mdate 1981-01 1981-02 1981-03 1981-04 1981-05 2020-08 2020-09	NaN 0.031447 0.034338 -0.017775 0.000368 0.050129 -0.020338	NaN 0.000641 0.043392 -0.029303 0.020718 0.071553 -0.024782	NaN 0.024081 0.060206 -0.002552 0.035657 0.076713 -0.042851	NaN -0.001883 0.090606 -0.003691 0.062959 0.165289 -0.066764 -0.048785	NaN 0.006115 -0.052425 0.007337 0.068476 0.122546 0.009772		
mdate 1981-01 1981-02 1981-03 1981-04 1981-05 2020-08 2020-09 2020-10	NaN 0.031447 0.034338 -0.017775 0.000368 0.050129 -0.020338 -0.022938	NaN 0.000641 0.043392 -0.029303 0.020718 0.071553 -0.024782 -0.018253	NaN 0.024081 0.060206 -0.002552 0.035657 0.076713 -0.042851 -0.008879	NaN -0.001883 0.090606 -0.003691 0.062959 0.165289 -0.066764 -0.048785 0.125390	NaN 0.006115 -0.052425 0.007337 0.068476 0.122546 0.009772 -0.003723		

[480 rows x 11 columns]

Output for part 7:

portf_r	ır
1	0.011980
2	0.008312
3	0.009356
4	0.010551
5	0.010858
6	0.012008
7	0.012817
8	0.013812
9	0.014665
10	0.015816
Spread	0.003836
dtype:	float64

Output for part 8:

portf_r	ır
1	0.000556
2	0.004428
3	0.006921
4	0.009850
5	0.009972
6	0.009068
7	0.010314
8	0.011152
9	0.010892
10	0.014960
Spread	0.014404
dtype:	float64

Output for part 9:

	EW_alphas	EW_alpha_tstats
portf_nr		
1	-0.002583	-0.823146
2	-0.004644	-2.644778
3	-0.002771	-2.266313
4	-0.000842	-0.878880
5	0.000096	0.133591
6	0.001456	2.181240
7	0.002512	3.811645
8	0.003563	5.144844
9	0.004273	5.315209
10	0.004444	3.311954
Spread	0.007027	2.030369

Output for part 10:

	VW_alphas	<pre>VW_alpha_tstats</pre>
portf_nr		
1	-0.015832	-5.462913
2	-0.009966	-4.847471
3	-0.005650	-3.628101
4	-0.001643	-1.408868
5	-0.000825	-1.020090
6	-0.001114	-1.604570
7	0.000491	0.654656
8	0.001369	1.963817
9	0.001285	1.355809
10	0.004613	3.012605
Spread	0.020446	5.380577