MARKET SIMULATION REPORT

BY JOHN VAN BREDERODE

COVID-19 PORTFOLIO (2020-2021)

The first portfolio I created and simulated was the COVID data, using BUY and sell orders from 2020 and 2021. The order book was as follows:

ORDERS:				
	Symbol	Order	Shares	
Date				
2020-02-03	MMM	BUY	5000	
2020-02-05	ZM	BUY	5000	
2020-02-05	AMD	BUY	500	
2020-03-05	BDX	BUY	500	
2020-05-07	AMD	SELL	500	

MMM is a mask manufacturing company, ZM is Zoom, AMD is a computer parts manufacturer, and BDX is a medical technology company.

These stocks were chosen due to their high likelihood of good performance during the COVID-19 pandemic.

Below are the relevant statistics for this portfolio:

RELEVANT PRICES:						CHANGES					
ZM	MMM	AMD	BDX	Cash		ZM	MMM	AMD	BDX	Cash	
87.6600	107.5381	48.0200	254.6260	1.0000	2020-02-03		5000			-540389.0619	
85.7900	107.9845	49.4500	259.3116	1.0000	2020-02-04					0.0000	
86.9900	111.4801	49.8400	260.7156	1.0000	2020-02-05	5000		500		-462189.2393	
87.2600	111.8646	49.3200	229.9574	1.0000	2020-02-06					0.0000	
88.6400	109.9349	49.7300	225.0893	1.0000	2020-02-07					0.0000	
143.4400	102.8365	52.5600	233.4819	1.0000	2020-05-04					0.0000	
144.8200	102.1644	52.1900	239.3630	1.0000	2020-05-05					0.0000	
149.5900	101.3120	52.1600	237.0123	1.0000	2020-05-06					0.0000	
157.8000	100.9932	51.9500	234.3782	1.0000	2020-05-07			-500		25835.1754	
155.4000	102.9128	53.1900	232.7593	1.0000	2020-05-08				-500	115787.7905	
3 4 5 6 7	ZM 3 87.6600 4 85.7900 5 86.9900 6 87.2600 7 88.6400 4 143.4400 5 144.8200 6 149.5900 7 157.8000	ZM MMM 5 87.6600 107.5381 6 85.7900 107.9845 5 86.9900 111.4801 6 87.2600 111.8646 7 88.6400 109.9349 4 143.4400 102.8365 5 144.8200 102.1644 6 149.5900 101.3120 7 157.8000 100.9932	ZM MMM AMD 3 87.6600 107.5381 48.0200 4 85.7900 107.9845 49.4500 5 86.9900 111.4801 49.8400 6 87.2600 111.8646 49.3200 7 88.6400 109.9349 49.7300 4 143.4400 102.8365 52.5600 5 144.8200 102.1644 52.1900 6 149.5900 101.3120 52.1600 7 157.8000 100.9932 51.9500	ZM MMM AMD BDX 3 87.6600 107.5381 48.0200 254.6260 4 85.7900 107.9845 49.4500 259.3116 5 86.9900 111.4801 49.8400 260.7156 6 87.2600 111.8646 49.3200 229.9574 7 88.6400 109.9349 49.7300 225.0893 4 143.4400 102.8365 52.5600 233.4819 5 144.8200 102.1644 52.1900 237.0123 7 157.8000 100.9932 51.9500 234.3782	ZM MMM AMD BDX Cash 3 87.6600 107.5381 48.0200 254.6260 1.0000 4 85.7900 107.9845 49.4500 259.3116 1.0000 5 86.9900 111.4801 49.8400 260.7156 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ASSETS						DAILY HOLDINGS:		
	ZM	MMM	AMD	BDX	Cash	ZM MMM A	MD BDX	Cash
2020-02-03	0.0000	537690.6586	0.0000	0.0000	459610.9381	2020-02-03 0 5000		-540389.0619
2020-02-04	0.0000	539922.6379	0.0000	0.0000	459610.9381	2020-02-04 0 5000		-540389.0619
2020-02-05	434949.9893	557400.4364	24920.0001	0.0000	-2578.3012	2020-02-05 5000 5000 5	00 0	-1002578.3012
2020-02-06	436300.0107	559323.2346	24659.9998	0.0000	-2578.3012	2020-02-06 5000 5000 5	00 0	-1002578.3012
2020-02-07	443199.9969	549674.4919	24864.9998	0.0000	-2578.3012	2020-02-07 5000 5000 5	00 0	-1002578.3012
2020-05-04	717200.0122	514182.7393	26280.0007	116740.9286	-114426.7049	2020-05-04 5000 5000 5	00 500	-1114426.7049
2020-05-05	724100.0366	510821.8765	26094.9993	119681.4880	-114426.7049	2020-05-05 5000 5000 5	00 500	-1114426.7049
2020-05-06	747949.9817	506560.0204	26079.9999	118506.1722	-114426.7049	2020-05-06 5000 5000 5	00 500	-1114426.7049
2020-05-07	789000.0153	504966.2018	0.0000	117189.0945	-88591.5295	2020-05-07 5000 5000	0 500	-1088591.5295
2020-05-08	776999.9695	514563.9038	0.0000	0.0000	27196.2610	2020-05-08 5000 5000		-972803.7390



ANALYSIS

The selected COVID-19 portfolio of ZM, MMM, AMD, and BDX significantly outperformed the market, with a Sharpe Ratio of 2.32. This can be seen in the graph to the left, plotting the normalized prices. The cumulative return of the portfolio was 32% and was much larger than the -9% from the SPY. Additionally, the average daily return of the portfolio was 0.4%, which was also much larger than the SPY daily return.

Date Range: 2020-02-03 to 2020	-05-08 (portfolio)		Portfolio Value	SPY
Number of Trading Days:	68	2020-02-03	997301.5967	302.4357
Sharpe Ratio of Fund:	+2.32167121386	2020-02-04	999533.5761	307.0453
Sharpe Ratio of SPY:	-0.34569253133	2020-02-05	1014692.1246	310.5911
Cumulative Return of Fund:	+0.32232830933	2020-02-06	1017704.9439	311.6362
Cumulative Return of SPY:	-0.09243574357	2020-02-07	1015161.1874	309.9752
Standard Deviation of Fund:	+0.03200107893			
Standard Deviation of SPY:	+0.03632560623	2020-05-04	1259976.9759	266.1546
Average Daily Return of Fund:	+0.00468020706	2020-05-05	1266271.6956	268.6137
Average Daily Return of SPY:	-0.00079104756	2020-05-06	1284669.4694	266.7928
		2020-05-07	1322563.7821	270.0121
Final Portfolio Value:	+1,318,760.13427047734	2020-05-08	1318760.1343	274.4799

For my post-2022 portfolio, I selected stocks from the 2022 top 100 ESG list.

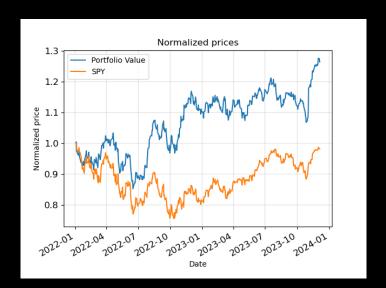
The portfolio included Texas Instruments, Apple, Chevron, Gartner, Merck, Coca-Cola, First-Solar, and Sempra.

Date,Symbol,Order,Shares	PORTFOLIO	CHANG	ES										
2022-01-03,TXN,BUY,500		TXN					КО	AAPL	SRE	MRK		Cash	
	2022-01-03			50			00		1500		-827540		
2022-01-03,K0,BUY,500	2022-01-04 2022-01-05					0 0	0	Θ Θ	0 0	Θ Θ		.0000	
2022-01-03,IT,BUY,1500	2022-01-03					0	0	0	0	0		.0000	
2022-01-03,CVX,BUY,500	2022-01-07											.0000	
2022-07-05,AAPL,BUY,500													
2022-01-03,FSLR,BUY,500	2023-12-01											.0000	
2022-01-03,SRE,BUY,1500	2023-12-02					0						.0000	
2023-12-05,AAPL,SELL,500	2023-12-03 2023-12-04					0	0	0 0	0	0 0		.0000	
2022-01-03,MRK,BUY,500	2023-12-04							-500			95852		
RELEVANT PRICES:													
TXN CVX	FSLR		IT		А	APL		SRE		MRK	Cash		
2022-01-03 175.8912 107.2701	88.5800 3	321.9	600		179.2	736	60	.9777	71.	5640	1.0000		
2022-01-04 176.0758 109.2219	87.2800 3	323.4	100		176.9	983	62	.0772	71.	6943	1.0000		
2022-01-05 172.4029 109.9324	83.5100 3	03.2	100		172.2	902	62	.4561	73.	4352	1.0000		
2022-01-06 172.3475 110.8679	83.9700 3	06.2	300		169.4	141	62	.9042	73.	3887	1.0000		
2022-01-07 165.5924 112.4599	84.6800 2	299.3	900		169.5	816	63	.8513	74.	7572	1.0000		
2023-11-29 149.9367 139.3736	155.4300 4	30.1	200		188.6	541	71	.1386	99.	1768	1.0000		
2023-11-30 149.4572 139.0734	157.7800 4	34.8	400		189.2	319	71	.0606	100.	5007	1.0000		
2023-12-01 151.9039 140.2453	160.2900 4	41.1	400		190.5	171	71	.3824	101.	4618	1.0000		
2023-12-04 154.0668 140.3034	159.5400 4	139.5	800		188.7	139	71	.0020	103.	9309	1.0000		
2023-12-05 153.9005 138.3567	155.3900 4	134.8	300		192.6	888	69	.7386	104.	1783	1.0000		
ASSETS													
TXN	CVX	FS	LR				SRE		MR	К	С	ash	
2022-01-03 87945.6024 53635.	.0250 4429	0.00	09		9146	6.5	890	3578	1.986	2 17	72459.0	566	
2022-01-04 88037.8876 54610.	.9428 4363	9.99	94		9311	5.8	714	3584	7.160	3 17	72459.0	566	
2022-01-05 86201.4618 54966.	.2247 4175	55.00	11		9368	4.1	278	3671	7.613	2 17	72459.0	566	
2022-01-06 86173.7671 55433.	.9447 4198	35.00	06		9435	6.3	194	3669	4.343	6 17	72459.0	566	
2022-01-07 82796.2112 56229.	.9728 4234	0.00	02		9577	6.9	260	3737	8.612	5 17	72459.0	566	
2023-12-01 75951.9653 70122.	.6349 8014	14.99	66		10707	3.5	321	5073	0.903	6 10	2192.3	209	
2023-12-02 75951.9653 70122.					10707	3.5	321	5073	0.903	6 10	2192.3	209	
2023-12-03 75951.9653 70122.	.6349 8014	14.99	66		10707	3.5	321	5073	0.903	6 10	2192.3	209	
2023-12-04 77033.4167 70151.											2192.3		
2023-12-05 76950.2411 69178.											8045.0		

ANALYSIS

The selected ESG portfolio post-2022 performed moderately, with a Sharpe Ratio of 0.73. The overall volatility of the fund was almost identical to SPY, and the average daily return was 0.00056. The cumulative return was 0.26.

I chose ESG stocks to gauge the profitability of stocks with high ESG scores. I expected a better performing portfolio, but the portfolio seemed to follow the market quite closely.



	Portfolio Value	SPY	Date Range: 2022-01-03 to 2023	3-12-05 (portfolio)
2022-01-03	995813.5774	460.1273	Number of Trading Days:	484
2022-01-04	1000576.9441	459.9732	Sharpe Ratio of Fund:	+0.73031793275
2022-01-05	968579.6392	451.1407	Sharpe Ratio of SPY:	+0.05107464083
2022-01-06	974281.3203	450.7169	Cumulative Return of Fund:	+0.26478228803
2022-01-07	963835.2353	448.9350	Cumulative Return of SPY:	-0.01790269337
			Standard Deviation of Fund:	+0.01217816921
2023-11-29	1248607.3542	449.9203	Standard Deviation of SPY:	+0.01245722823
2023-11-30	1257633.8664	451.6919	Average Daily Return of Fund:	+0.00056026527
2023-12-01	1271851.7524	454.3640	Average Daily Return of SPY:	+0.00004007989
2023-12-04	1269525.4889	451.9789		
2023-12-05	1259487.3749	451.8898	Final Portfolio Value:	+1,259,487.37486763019

VARYING TRANSACTION COSTS AND MARKET IMPACT FACTOR

Date Range: 2022-01-03 to 2023-12-05 (portfolio) Number of Trading Days: 484 Sharpe Ratio of Fund: +0.72673452272 Sharpe Ratio of SPY: +0.05107464083 Cumulative Return of Fund: +0.26530623293 Cumulative Return of SPY: -0.01790269337 Standard Deviation of Fund: +0.01228547397 Standard Deviation of SPY: +0.01245722823 Average Daily Return of Fund: +0.00056242865 Average Daily Return of SPY: +0.00004007989

Final Portfolio Value: +1,249,582.31310386676

The above image shows the result when the market impact factor is 0.015, and the transaction fee is 10.95.

As expected, the portfolio value is slightly lower.

MARKET SIMULATOR APPROACH AND CHALLENGES

For the simulator, I followed the approach in the provided slideshow.

First, I created the ORDERS data frame, sorted by date. The execution of the orders allowed me to make a PORTFOLIO CHANGES data frame. I used this data frame to create a DAILY HOLDINGS frame, which stored the daily values of the portfolio by numbers of shares and cash. This was done using cum_sum(). After this frame was created, I used this frame to create an ASSETS data frame, with the total share values each day for each stock. Finally, the ASSETS frame was used to calculate the total portfolio value by summing across the columns.

One of the biggest challenges for this project was the vague project specifications. It was hard to tell what the deliverables were, and it was confusing to determine what data to use to match outputs correctly. Additionally, some of the provided data (from the ZIP) was incomplete, causing numerous issues with the functions.

Overall, this project was an interesting learning experience, but could benefit from better organization. I had fun building the simulator, and hope to learn more in future projects.