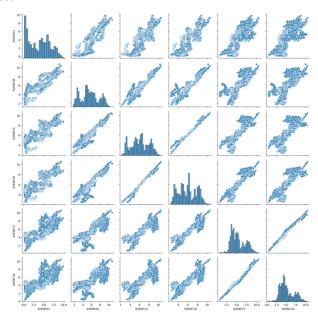
Machine Learning in Finance Lab – Week 05 Liao, Yu-Ching

Part 1. EDA:

• Scatter Plot Metrics:



• Shape of Data:

The number of Columns is 31 . The number of Rows is 8071 .

• Nature (truncated):

1	SVENF02	8071	0	0
2	SVENF03	8071	0	0
3	SVENF04	8071	0	0
4	SVENF05	8071	0	0
5	SVENF06	8071	0	0
6	SVENF07	8071	0	0
7	SVENF08	8071	0	0

• Summary of Statistics:

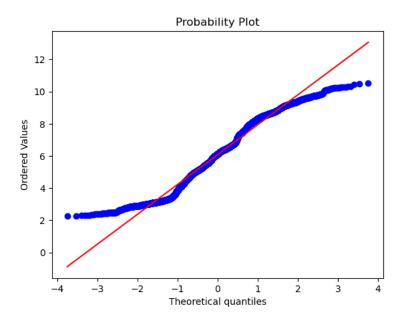
```
μ = 3.7853113740552597 Var = 7.011351664593713 σ = 2.647895705006848

Boundaries for 4 Equal Percentiles
[0.0727, 1.14405, 3.9865, 5.9015, 9.8138]

Boundaries for 10 Equal Percentiles
[0.0727, 0.3326, 0.8002, 1.5379, 2.6503, 3.9865, 4.705, 5.6197, 6.2687, 7.5553, 9.8138]

Unique Label Values
['SVENF61', 'SVENF26', 'SVENF07', 'SVENF22', 'SVENF21', 'SVENF06', 'SVENF12', 'SVENF30', 'SVENF15', 'SVENF14', 'SVENF17', 'SVENF10', 'SVENF16', 'SVENF04', 'SVENF05', 'SVENF28', 'SVENF13', 'SVENF09', 'SVENF09', 'SVENF09', 'SVENF09', 'SVENF11']
```

• QQ Plot:

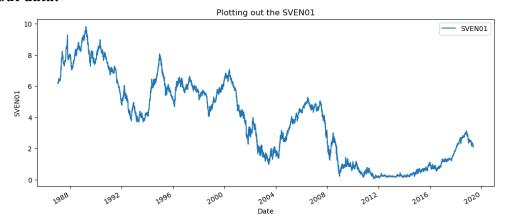


• Summary of data:

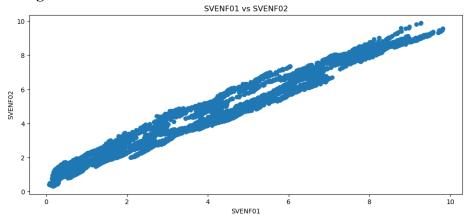
	SVENF01	SVENF02	SVENF03	SVENF04	SVENF05	\	
count	8071.000000	8071.000000	8071.000000	8071.000000	8071.000000		
mean	3.785311	4.258972	4.669363	5.022430	5.318493		
std	2.648060	2.498137	2.341348	2.221632	2.137801		
min	0.072700	0.327300	0.630300	1.013000	1.424500		
25%	1.144050	1.865600	2.536550	3.023050	3.544700		
50%	3.986500	4.393300	4.505500	4.718900	5.051300		
75%	5.901500	6.221250	6.461300	6.626600	6.779550		
max	9.813800	9.887800	10.145600	10.459900	10.649900		
	SVENF06	SVENF07	SVENF08	SVENF09	SVENF10		\
count	8071.000000	8071.000000	8071.000000	8071.000000	8071.000000		
mean	5.559644	5.750071	5.895135	6.000596	6.072112		
std	2.080405	2.040337	2.010786	1.987244	1.966960		
min	1.698200	1.807300	1.885000	1.942100	1.988200		
25%	4.063300	4.409750	4.644300	4.774550	4.859500		
50%	5.394600	5.663700	5.870800	5.993700	6.082400		
75%	6.908050	7.049900	7.181600	7.297550	7.393350		
max	10.741400	10.766300	10.747500	10.701500	10.640000		
	SVENF22	SVENF23	SVENF24	SVENF25	SVENF26	\	
						,	
count	8071.000000	8071.000000	8071.000000	8071.000000	8071.000000	•	
mean	8071.000000 5.689046	8071.000000 5.621666	8071.000000 5.554136	8071.000000 5.486943	8071.000000 5.420479	,	
mean std	8071.000000 5.689046 1.801291	8071.000000 5.621666 1.797858	8071.000000 5.554136 1.797012	8071.000000 5.486943 1.798842	8071.000000 5.420479 1.803390	,	
mean std min	8071.000000 5.689046 1.801291 1.489600	8071.000000 5.621666 1.797858 1.283000	8071.000000 5.554136 1.797012 1.100800	8071.000000 5.486943 1.798842 0.941000	8071.000000 5.420479 1.803390 0.801800	`	
mean std min 25%	8071.000000 5.689046 1.801291 1.489600 4.177450	8071.000000 5.621666 1.797858 1.283000 4.090550	8071.000000 5.554136 1.797012 1.100800 4.024800	8071.000000 5.486943 1.798842 0.941000 3.982950	8071.000000 5.420479 1.803390 0.801800 3.962100	,	
mean std min 25% 50%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700	•	
mean std min 25% 50% 75%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700 6.871050	•	
mean std min 25% 50%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700	•	
mean std min 25% 50% 75%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100	8071.000000 5.554136 1.797012 1.100800 4.024800 5.36900 7.114900 10.535100	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 10.535100	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700 6.871050 10.535100	•	
mean std min 25% 50% 75% max	8071.000000 5.689046 1.80129 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 10.535100 SVENF30	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700 6.871050 10.535100 Adj_Close	`	
mean std min 25% 50% 75% max	8071.000000 5.889046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27 8071.000000	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29 8071.000000	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 10.535100 SVENF30 8071.000000	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700 6.871050 10.535100 Adj_Close 8071.000000	`	
mean std min 25% 50% 75% max	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27 8071.000000 5.355063	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000 5.290948	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29 8071.000000 5.228333	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 10.535100 SVENF30 8071.000000 5.167371	8071.000000 5.420479 1.803390 0.801800 3.962100 5.996700 6.871050 10.535100 Adj_Close 8071.000000 5.509793	`	
mean std min 25% 50% 75% max count mean std	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27 8071.000000 5.355063 1.810643	8071.000000 5.621666 1.797858 1.283000 4.090550 5.593000 7.233200 10.535100 SVENF28 8071.000000 5.290948 1.820541	8071.00000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29 8071.000000 5.228333 1.832984	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 10.535100 SVENF30 8071.000000 5.167371 1.847834	8071.000000 5.420479 1.803390 0.801800 3.962100 6.871050 10.535100 Adj_Close 8071.000000 5.509793 2.491110	`	
mean std min 25% 50% 75% max count mean std min	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 0.535100 SVENF27 8071.000000 5.355063 1.810643 0.681200	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000 5.290948 1.820541 0.577100	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 0.535100 SVENF29 8071.000000 5.228333 1.832984 0.487600	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 0.535100 SVENF30 8071.000000 5.167371 1.847834 0.411100	8071.000000 5.420479 1.803390 0.801800 3.962100 5.096700 6.871050 10.535100 Adj_Close 8071.000000 5.509793 2.491110 2.801050	•	
mean std min 25% 50% 75% max count mean std min 25%	8071.000000 5.689946 1.801291 1.489600 4.177450 5.619600 7.330550 10.335100 SVENF27 8071.000000 5.355963 1.810643 0.681200 3.887150	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000 5.290948 1.820541 0.577100 3.840900	8071.000000 5.554136 1.797012 1.100800 4.024800 7.114900 10.535100 SVENF29 8071.000000 5.228333 1.832984 0.487600	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 10.535100 SVENF30 8071.000000 5.167371 1.847834 0.411100 3.831350	8071.000000 5.420479 1.803390 0.801800 3.962100 6.871050 10.535100 Adj_Close 8071.000000 5.509793 2.491110 2.801050 3.130587	•	
mean std min 25% 50% 75% max count mean std min 25% 50%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27 8071.000000 5.355063 1.810643 0.681200 3.887150	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000 5.290948 1.820541 0.577100 3.840900 4.860800	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29 8071.000000 5.228333 1.832984 0.487600 3.025650 4.758600	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 0.535100 SVENF30 8071.000000 5.167371 1.847834 0.411100 3.831350 4.669900	8071.000000 5.420479 1.803390 0.801800 5.096700 6.871050 10.535100 Adj_Close 8071.000000 5.509793 2.491110 2.801050 3.130587 4.956219	•	
mean std min 25% 50% 75% max count mean std min 25% 50% 75%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27 8071.000000 5.355063 1.810643 0.681200 3.887150 4.979700 6.765400	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000 5.290948 1.820541 0.577100 3.840900 4.860800 6.6556600	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29 8071.000000 5.228333 1.832984 0.487500 3.825050 4.758600 6.535450	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 EVENF30 8071.000000 5.167371 1.847834 0.411100 3.831350 4.669000 6.421850	8071.000000 5.420479 1.803390 0.801800 5.906700 6.871050 10.535100 Adj_Close 8071.000000 5.509793 2.491110 2.801650 3.130587 4.956219 8.051437	•	
mean std min 25% 50% 75% max count mean std min 25% 50%	8071.000000 5.689046 1.801291 1.489600 4.177450 5.619600 7.330550 10.535100 SVENF27 8071.000000 5.355063 1.810643 0.681200 3.887150	8071.000000 5.621666 1.797858 1.283000 4.090550 5.503000 7.233200 10.535100 SVENF28 8071.000000 5.290948 1.820541 0.577100 3.840900 4.860800	8071.000000 5.554136 1.797012 1.100800 4.024800 5.369900 7.114900 10.535100 SVENF29 8071.000000 5.228333 1.832984 0.487600 3.025650 4.758600	8071.000000 5.486943 1.798842 0.941000 3.982950 5.228000 6.998150 0.535100 SVENF30 8071.000000 5.167371 1.847834 0.411100 3.831350 4.669900	8071.000000 5.420479 1.803390 0.801800 5.096700 6.871050 10.535100 Adj_Close 8071.000000 5.509793 2.491110 2.801050 3.130587 4.956219	•	

[8 rows x 31 columns]

• Plot out data:



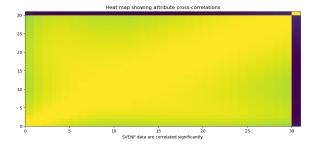
• Cross Plotting Pairs:



• Correlations (truncated):

	SVENF01	SVENF02	SVENF03	SVENF04	SVENF05	SVENF06	SVENF07	SVENF08	SVENF09	SVENF10	 sv
SVENF01	1.000000	0.986417	0.958364	0.924637	0.890691	0.860385	0.835864	0.817792	0.805833	0.799116	 0.8
SVENF02	0.986417	1.000000	0.991325	0.971026	0.945906	0.920994	0.899469	0.882818	0.871309	0.864483	 0.8
SVENF03	0.958364	0.991325	1.000000	0.993681	0.978891	0.960996	0.943810	0.929497	0.918916	0.912072	 0.9
SVENF04	0.924637	0.971026	0.993681	1.000000	0.995480	0.985206	0.973186	0.962005	0.952978	0.946523	 0.9
SVENF05	0.890691	0.945906	0.978891	0.995480	1.000000	0.996934	0.990180	0.982494	0.975478	0.969858	 0.9
SVENF06	0.860385	0.920994	0.960996	0.985206	0.996934	1.000000	0.998022	0.993749	0.988922	0.984458	 0.9
SVENF07	0.835864	0.899469	0.943810	0.973186	0.990180	0.998022	1.000000	0.998756	0.996054	0.992905	 0.9
SVENF08	0.817792	0.882818	0.929497	0.962005	0.982494	0.993749	0.998756	1.000000	0.999202	0.997388	 0.9
SVENF09	0.805833	0.871309	0.918916	0.952978	0.975478	0.988922	0.996054	0.999202	1.000000	0.999443	0.9

• Correlations Visualization:



Part 2. PCA:

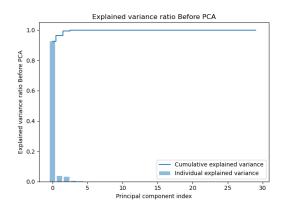
Explained Variance Ratio Before PCA:
[9.25027254e-01 3.77198563e-02 3.11962115e-02 5.11829721e-03
8.45006479e-04 8.14071111e-05 1.06386900e-05 1.23073879e-06
8.99497477e-08 7.14094977e-09 4.89071592e-10 3.83422436e-11
8.63162713e-12 7.54060102e-12 7.44722038e-12 7.41409677e-12
7.37633844e-12 7.36922042e-12 7.21033060e-12 7.16011018e-12
7.08499808e-12 7.01615861e-12 6.97953948e-12 6.83297854e-12
6.78790385e-12 6.76011093e-12 6.68796631e-12 6.63106214e-12
6.57322725e-12 6.42225375e-12]

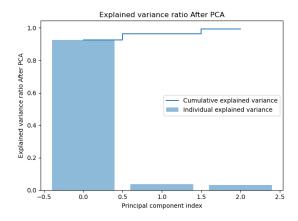
Culmulative Variance Ratio Before PCA:

[0.92502725 0.96274711 0.99394332 0.99906162 0.99990663 0.99998803 1. 0.99999867 0.9999999 0.99999999 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1.

Explained Variance Ratio After PCA: [0.92502725 0.03771986 0.03119621]

Culmulative Variance Ratio After PCA: [0.92502725 0.96274711 0.99394332]

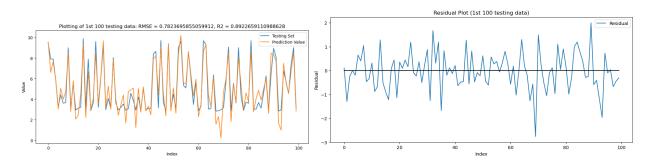




Part 3. Linear Regression VS SVM:

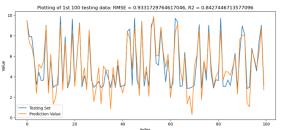
• Linear Regression with all features:

Training Set R_Square: 0.8916880358469877 Training Set RMSE: 0.7766533040370089 Testing Set R_Square: 0.8922659110988628 Testing Set RMSE: 0.7823695855059912



• Linear Regression with PCA:

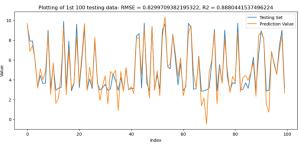
Training Set R_Square: 0.8486173333869106 Training Set RMSE: 0.9010775907448826 Testing Set R_Square: 0.8427446713577096 Testing Set RMSE: 0.9331729764617046

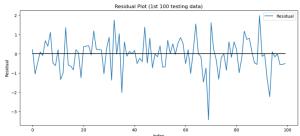




• SVM with all features:

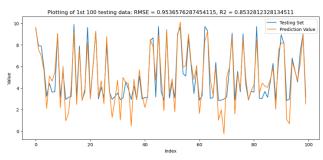
Training Set R_Square: 0.8902331608101304 Training Set RMSE: 0.8092306402122806 Testing Set R_Square: 0.8880441537496224 Testing Set RMSE: 0.8299709382195322





• SVM with PCA:

Training Set R_Square: 0.8597318320491025 Training Set RMSE: 0.917069041995177 Testing Set R_Square: 0.8532812328134511 Testing Set RMSE: 0.9536576287454115





Part 4. Conclusion:

From the R_square and RMSE, we can notice that, with PCA, the performance of the model will **not necessary be better**. In this case, I think it is because, reducing the features from 30 to 3, we may have as well reduced the pivotal signal of data.

And to compare Linear Regression and SVM, we can notice that **none of them is significantly better**. However, there is **large gap in their learning times (as shown below)**.

As a result, I would still use linear regression if there are no necessity to use SVM, and I would test several different number of components so that we can still retain pivotal signal in our model.

	Linear Reg. (all)	Linear Reg. (PCA)	SVM (all)	SVM (PCA)
R_Square (Train)	0.89	0.84	0.88	0.85
R_Square (Test)	0.89	0.84	0.89	0.85
RMSE (Train)	0.77	0.90	0.81	0.91
RMSE (Test)	0.78	0.92	0.82	0.95
Times	323ms	282ms	12.9s	10.9s

Part 5. Appendix:

Github: https://github.com/yu7yu7/IE517 Machine-Learning-in-Finance-Lab/blob/main/IE517 SP23 HW5/ML Week05 HW.ipynb

Part 6. Sign:

My name is Yu-Ching Liao.

My NetID is ycliao3.

I hereby certify that I have read the University policy on Academic Integrity and that I am not in violation.