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**Student ID:** 20165327

**Date:** June 7<sup>th</sup>, 2017

## Assignment 3

### 1. Merging Trade and Quote Data

- Date of analysis: **August 26, 2015**
- Information of stock for analysis:

No	Cusip number (8 digit)	Cusip number (9 digit)	Stock Market	Symbol	Company name
1	62671710	302491303	N	FMC	FMC Corp
2	56584910	565849106		MRO	Marathon Oil Corporation
3	62671710	626717102		MUR	Murphy Oil Corporation
4	88250810	882508104		TXN	Texas Instruments Incorporated
5	91301710	913017109		UTX	United Technologies Corporation
6	11132010	111320107	Q	BRCM	Broadcom Ltd
7	63110310	631103108		NDAQ	Nasdaq Inc
8	70339510	703395103		PDCO	Patterson Companies, Inc.
9	98313410	983134107		WYNN	Wynn Resorts, Limited
10	98970110	989701107		ZION	Zions Bancorp

To compute the liquidity variables, these steps were performed:

- **Step 1:** Clean the NBBO, Trade, Quote data.
- **Step 2:** Create the merged data: OfficialCompleteNBBO, TradesandCorrespondingNBBO, BuySellIndicators.
- **Step 3:** Compute the spreads

a) Report the effective spreads of selected stocks.

- The effective spreads were derived from **step 11** in the provided code.
- The data was used: **BuySellIndicators**.

SYM_ROOT	DATE	sumdollar	sumsize	EffectiveSpread_Dollar_Ave	EffectiveSpread_Percent_Ave	EffectiveSpread_Dollar_DW	EffectiveSpread_Dollar_SW	EffectiveSpread_Percent_DW	EffectiveSpread_Percent_SW
BRCM	26-Aug-15	407182159.7	8295301	0.012275618	0.000250542	0.019424895	0.019518123	0.000397625	0.000399576
FMC	26-Aug-15	134740469.8	3374155	0.016367061	0.000409573	0.0882809	0.088776165	0.002209145	0.002221561
MRO	26-Aug-15	171016018.4	11893678	0.009431241	0.000656046	0.012335145	0.012425825	0.000859122	0.000865541
MUR	26-Aug-15	57085655.29	2084397	0.013911331	0.000508126	0.013770176	0.013777299	0.000503026	0.000503302
NDAQ	26-Aug-15	268729782.3	5481433	0.017372876	0.000353403	0.039651869	0.039219671	0.000793055	0.000784618
PDCO	26-Aug-15	66585981.95	1382089	0.019253721	0.000400306	0.039855755	0.039996724	0.000829015	0.000832007
TXN	26-Aug-15	724175260.8	16276823	0.011291965	0.000253971	0.038127348	0.03810515	0.000855612	0.000855241
UTX	26-Aug-15	592203877.9	6577123	0.027456447	0.000305229	0.027258328	0.027278729	0.00030296	0.000303208
WYNN	26-Aug-15	325504248.3	4424354	0.056605885	0.000767188	0.066199345	0.065507971	0.000889967	0.000881199
ZION	26-Aug-15	87672669.2	3216115	0.010498453	0.000385232	0.014737142	0.014727644	0.000539921	0.000539602

b) Report the quoted spreads of selected stocks.

- The quoted spreads were derived from **step 12** in the provided code.
- The data was used: **OfficialCompleteNBBO** and **QSpread**.

SYM_ROOT	DATE	sumtime	QuotedSpread_Dollar	QuotedSpread_Percent	BestOfcDepth_Dollar	BestBidDepth_Dollar	BestOfcDepth_Share	BestBidDepth_Share
BRCM	26-Aug-15	23362.60868	0.01609655	0.00032971	22577.61218	24333.54723	460.6450701	496.6792515
FMC	26-Aug-15	23374.70708	0.036597954	0.000912346	9951.270513	9784.698402	248.9217339	244.9425936
MRO	26-Aug-15	23335.07182	0.01027877	0.000717416	32293.10314	29328.37447	2245.911799	2041.382614
MUR	26-Aug-15	23396.88977	0.020821143	0.000761716	13266.66672	12070.20581	484.7934321	441.4471545
NDAQ	26-Aug-15	23388.88161	0.031371918	0.000638757	11766.61018	13894.49651	239.933062	283.6092007
PDCO	26-Aug-15	23387.92503	0.034839018	0.000726926	11149.36707	12128.64678	232.1441192	252.8266555
TXN	26-Aug-15	23304.05658	0.01320656	0.0002981	22589.58345	23506.76799	509.026191	529.4514039
UTX	26-Aug-15	23391.59608	0.042950001	0.000478067	32647.47287	33663.71617	363.071857	374.9225893
WYNN	26-Aug-15	23399.90003	0.090240633	0.001223768	17490.88222	16984.63931	237.8152844	231.5745046
ZION	26-Aug-15	23376.28106	0.011806786	0.000434285	17296.95608	17221.10299	634.9247662	633.1220366

c) Report the realized spreads of selected stocks.

- The realized spreads were derived from **step 12** in the provided code.
- The data was used: **BuySellIndicators** and **QSpread**.

SYM_ROOT	DATE	sumdollar	sumsize	DollarRealizedSpread_LR_Ave	DollarRealizedSpread_MO_Ave	DollarRealizedSpread_LNV_Ave	PercentRealizedSpread_LR_Ave	PercentRealizedSpread_EMO_Ave	PercentRealizedSpread_CLNV_Ave
BRCM	26-Aug-15	453055895.8	9229454	0.006339436	0.005147926	0.005265193	0.000128554	0.000104082	0.000106519
FMC	26-Aug-15	141849713.5	3552133	0.010352814	0.010118967	0.009745057	0.000259925	0.000254273	0.000244754
MRO	26-Aug-15	186934463.4	13002588	-0.001554325	-0.001484823	-0.001247388	-0.00010859	-0.000104064	-8.75406E-05
MUR	26-Aug-15	59899825.74	2187097	-0.002230059	-0.000927641	-0.000618088	-8.17888E-05	-3.42021E-05	-2.29895E-05
NDAQ	26-Aug-15	279520201.9	5701712	0.008681306	0.005145828	0.006045698	0.000177203	0.000105327	0.000123621
PDCO	26-Aug-15	68537023.82	1422377	0.007942171	0.005537581	0.006324007	0.000165581	0.000115397	0.000131739
TXN	26-Aug-15	780163765	17535078	-0.001989805	-0.001372694	-0.001343708	-4.60769E-05	-3.21544E-05	-3.15973E-05
UTX	26-Aug-15	601874441.1	6684219	0.005686812	0.004556969	0.003969901	6.29302E-05	5.04948E-05	4.40111E-05
WYNN	26-Aug-15	325760631.3	4427843	0.016712443	0.007853065	0.012040373	0.000222203	0.000102052	0.000158576
ZION	26-Aug-15	98354707.75	3607921	-0.003503174	-0.003884518	-0.003618221	-0.000128793	-0.000142703	-0.000132983
SYM_ROOT	DATE	sumdollar	sumsize	DollarPriceImpact_LR_Ave	DollarPriceImpact_MO_Ave	DollarPriceImpact_CLNV_Ave	PercentPriceImpact_LR_Ave	PercentPriceImpact_EMO_Ave	PercentPriceImpact_CLNV_Ave
BRCM	26-Aug-15	453055895.8	9229454	0.004841289	0.005551158	0.005660089	9.96356E-05	0.000114236	0.000116443
FMC	26-Aug-15	141849713.5	3552133	0.005245942	0.00392305	0.005290914	0.000130419	9.71711E-05	0.000131517
MRO	26-Aug-15	186934463.4	13002588	0.009976666	0.009696654	0.009630474	0.000694461	0.00067526	0.000670677
MUR	26-Aug-15	59899825.74	2187097	0.015516465	0.013721148	0.013739563	0.000567081	0.000501511	0.000502253
NDAQ	26-Aug-15	279520201.9	5701712	0.007744454	0.010012408	0.00987259	0.00015694	0.000203129	0.000200214
PDCO	26-Aug-15	68537023.82	1422377	0.010784286	0.011586877	0.011610814	0.000223762	0.0002406	0.000241122
TXN	26-Aug-15	780163765	17535078	0.012507864	0.01151418	0.011612531	0.000282637	0.000260253	0.000262556
UTX	26-Aug-15	601874441.1	6684219	0.021413365	0.019721324	0.022342975	0.000238337	0.000219398	0.000248513
WYNN	26-Aug-15	325760631.3	4427843	0.0398581	0.039766128	0.042468532	0.000544506	0.000543629	0.000580254
ZION	26-Aug-15	98354707.75	3607921	0.012897632	0.01303769	0.012988141	0.000473519	0.00047856	0.000476807
SYM_ROOT	DATE	sumdollar	sumsize	DollarRealizedSpread_LR_SW	DollarRealizedSpread_LR_DW	PercentRealizedSpread_LR_SW	PercentRealizedSpread_LR_DW	DollarPriceImpact_LR_SW	DollarPriceImpact_LR_DW
BRCM	26-Aug-15	453055895.8	9229454	0.019208464	0.019116917	0.000393141	0.00039124	-0.001432033	-0.001425342
FMC	26-Aug-15	141849713.5	3552133	0.032382431	0.032109642	0.000815546	0.000808701	0.052138954	0.051940424
MRO	26-Aug-15	186934463.4	13002588	0.006856169	0.006762248	0.000478874	0.000472295	0.00452255	0.004535328
MUR	26-Aug-15	59899825.74	2187097	-0.004357827	-0.004416315	-0.000158756	-0.000160895	0.017550685	0.017602129
NDAQ	26-Aug-15	279520201.9	5701712	0.005144701	0.005589383	9.75522E-05	0.000106716	0.032612933	0.032584967
PDCO	26-Aug-15	68537023.82	1422377	0.023347897	0.023169388	0.000488634	0.000484877	0.015536043	0.015571905
TXN	26-Aug-15	780163765	17535078	0.0377271	0.037659076	0.000844996	0.000843379	-0.002192891	-0.002104448
UTX	26-Aug-15	601874441.1	6684219	0.032899263	0.033028502	0.000364566	0.000365986	-0.00594405	-0.006094766
WYNN	26-Aug-15	325760631.3	4427843	-0.007738248	-0.008280116	-9.91856E-05	-0.000106	0.073201579	0.074434347
ZION	26-Aug-15	98354707.75	3607921	-0.005901702	-0.005909294	-0.000216274	-0.000216547	0.01908358	0.019099441
SYM_ROOT	DATE	sumdollar	sumsize	PercentPriceImpact_LR_SW	PercentPriceImpact_LR_DW	DollarRealizedSpread_MO_SW	DollarRealizedSpread_MO_DW	PercentRealizedSpread_EMO_SW	PercentRealizedSpread_EMO_DW
BRCM	26-Aug-15	453055895.8	9229454	-2.92375E-05	-2.91129E-05	0.018602802	0.018518687	0.000380637	0.000378889
FMC	26-Aug-15	141849713.5	3552133	0.001299536	0.001294566	0.036825332	0.036647127	0.000924719	0.0009202
MRO	26-Aug-15	186934463.4	13002588	0.000313713	0.000314547	0.007382882	0.007285335	0.000515594	0.000508751
MUR	26-Aug-15	59899825.74	2187097	0.000640704	0.00064257	-0.002812837	-0.002865416	-0.000102593	-0.000104516
NDAQ	26-Aug-15	279520201.9	5701712	0.000657837	0.000656809	0.003266202	0.003697135	5.95126E-05	6.83952E-05
PDCO	26-Aug-15	68537023.82	1422377	0.000320224	0.000320956	0.022114655	0.021921052	0.000463336	0.000459267
TXN	26-Aug-15	780163765	17535078	-4.74553E-05	-4.54987E-05	0.036107662	0.03603363	0.000808674	0.000806924
UTX	26-Aug-15	601874441.1	6684219	-6.49532E-05	-6.66329E-05	0.02768433	0.027798942	0.000306752	0.000308012
WYNN	26-Aug-15	325760631.3	4427843	0.000979785	0.000995362	-0.015145494	-0.015707981	-0.000199853	-0.000206956
ZION	26-Aug-15	98354707.75	3607921	0.000699245	0.000699795	-0.005511215	-0.005524042	-0.000201672	-0.000202138

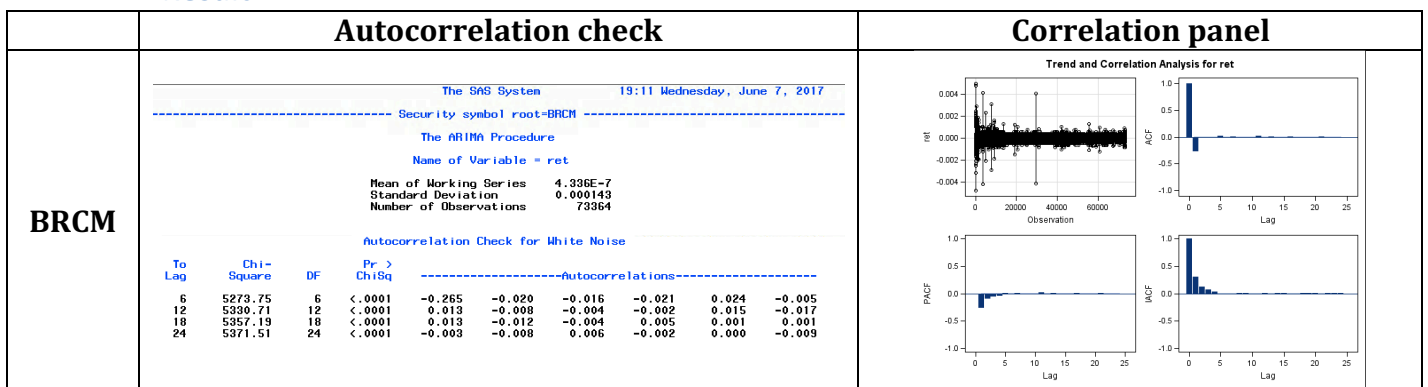
SYM_ROOT	DATE	sumdollar	sumsize	DollarPriceImpact_EMO _SW	DollarPriceImpact_EMO _DW	PercentPriceImpact_EM O_SW	PercentPriceImpact_EM O_DW	DollarRealizedSpread_CL NV_SW	DollarRealizedSpread_CLNV_D W
BRCM	26-Aug-15	453055895.8	9229454	-0.001449267	-0.001445079	-2.9528E-05	-2.94536E-05	0.01862363	0.01853584
FMC	26-Aug-15	141849713.5	3552133	0.045554663	0.045252736	0.001136967	0.001129455	0.037536649	0.037357859
MRO	26-Aug-15	186934463.4	13002588	0.003618976	0.003637086	0.000250658	0.000251877	0.007366585	0.007274168
MUR	26-Aug-15	59899825.74	2187097	0.015506075	0.01555183	0.00056629	0.000567949	-0.003591535	-0.003640402
NDAQ	26-Aug-15	279520201.9	5701712	0.033525655	0.033505629	0.000676293	0.00067543	0.003175829	0.003612609
PDCO	26-Aug-15	68537023.82	1422377	0.015291298	0.015348174	0.000314724	0.000315893	0.022104059	0.021931634
TXN	26-Aug-15	780163765	17535078	-0.000956763	-0.000862938	-1.97356E-05	-1.76585E-05	0.037259408	0.037190432
UTX	26-Aug-15	601874441.1	6684219	-0.003227014	-0.003361011	-3.49038E-05	-3.63992E-05	0.030592403	0.030715004
WYNN	26-Aug-15	325760631.3	4427843	0.071261402	0.072470178	0.000953975	0.000969274	-0.008480163	-0.009021681
ZION	26-Aug-15	98354707.75	3607921	0.018465463	0.01848701	0.000676275	0.000677036	-0.006338449	-0.006345767
SYM_ROOT	DATE	sumdollar	sumsize	PercentRealizedSpread _CLNV_SW	PercentRealizedSpread _CLNV_DW	DollarPriceImpact_CLN V_SW	DollarPriceImpact_CLNV _DW	PercentPriceImpact_CLN V_SW	PercentPriceImpact_CLNV_DW
BRCM	26-Aug-15	453055895.8	9229454	0.00038113	0.000379307	-0.001154699	-0.001149231	-2.35458E-05	-2.34467E-05
FMC	26-Aug-15	141849713.5	3552133	0.000942562	0.000938026	0.045970553	0.045671334	0.001147297	0.001139853
MRO	26-Aug-15	186934463.4	13002588	0.000514181	0.000507698	0.003954399	0.00396583	0.00027438	0.000275128
MUR	26-Aug-15	59899825.74	2187097	-0.000131029	-0.000132817	0.016629006	0.016671133	0.000607292	0.000608819
NDAQ	26-Aug-15	279520201.9	5701712	5.74961E-05	6.65007E-05	0.034266362	0.034244777	0.000691489	0.000690589
PDCO	26-Aug-15	68537023.82	1422377	0.000462687	0.000459059	0.016049254	0.016081697	0.000330951	0.000331611
TXN	26-Aug-15	780163765	17535078	0.000834354	0.000832715	-0.001953964	-0.001864748	-4.19518E-05	-3.99762E-05
UTX	26-Aug-15	601874441.1	6684219	0.000339028	0.000340376	-0.004278572	-0.004422839	-4.65364E-05	-4.8146E-05
WYNN	26-Aug-15	325760631.3	4427843	-0.000109272	-0.000116091	0.071590967	0.072814695	0.000958005	0.000973477
ZION	26-Aug-15	98354707.75	3607921	-0.000232326	-0.000232588	0.019496383	0.019511992	0.000714418	0.000714957

## 2. Time-Series Analysis

- For each return series, test the null hypothesis that the first 12 lags of autocorrelations are zero at 5% level.
- This is done by using the following statement in sas:  

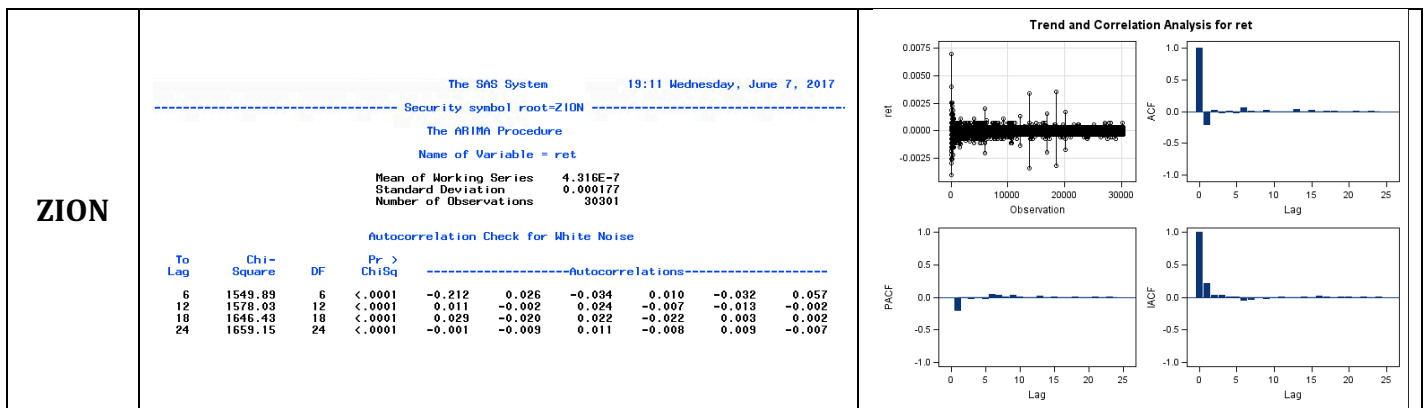
```
proc arima data=trade;
by sym_root;
identify var=ret;
run;
quit;
```
  - Significant level:  $\alpha = 0.05$
  - Hypothesis:
    - Null hypothesis: lags of autocorrelations are zero
    - Alternative hypothesis: at least one lag is not zero
- Or:
- $H_0: \rho_l = 0$  for all  $l$
  - $H_1: \rho_l \neq 0$  for at least one  $l$

## Result



FMC	<div><div>Security symbol root=FMC</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series -5.79E-7</div><div>Standard Deviation 0.000316</div><div>Number of Observations 28511</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>3899.57</td><td>6</td><td>&lt;.0001</td><td>-0.365</td><td>-0.031</td><td>0.000</td><td>-0.016</td><td>0.001</td><td>0.051</td><td></td><td></td></tr><tr><td>12</td><td>3950.26</td><td>12</td><td>&lt;.0001</td><td>-0.015</td><td>-0.001</td><td>-0.011</td><td>0.014</td><td>-0.013</td><td>0.033</td><td></td><td></td></tr><tr><td>18</td><td>4034.85</td><td>18</td><td>&lt;.0001</td><td>-0.003</td><td>-0.012</td><td>-0.021</td><td>0.015</td><td>0.039</td><td>-0.025</td><td></td><td></td></tr><tr><td>24</td><td>4053.72</td><td>24</td><td>&lt;.0001</td><td>0.003</td><td>-0.004</td><td>-0.008</td><td>0.008</td><td>0.007</td><td>-0.021</td><td></td><td></td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	3899.57	6	<.0001	-0.365	-0.031	0.000	-0.016	0.001	0.051			12	3950.26	12	<.0001	-0.015	-0.001	-0.011	0.014	-0.013	0.033			18	4034.85	18	<.0001	-0.003	-0.012	-0.021	0.015	0.039	-0.025			24	4053.72	24	<.0001	0.003	-0.004	-0.008	0.008	0.007	-0.021			<div>Trend and Correlation Analysis for ret</div>
To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----																																																										
6	3899.57	6	<.0001	-0.365	-0.031	0.000	-0.016	0.001	0.051																																																					
12	3950.26	12	<.0001	-0.015	-0.001	-0.011	0.014	-0.013	0.033																																																					
18	4034.85	18	<.0001	-0.003	-0.012	-0.021	0.015	0.039	-0.025																																																					
24	4053.72	24	<.0001	0.003	-0.004	-0.008	0.008	0.007	-0.021																																																					
MRO	<div><div>The SAS System 19:11 Wednesday, June 7, 2017</div><div>Security symbol root=MRO</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series 2.99E-7</div><div>Standard Deviation 0.000343</div><div>Number of Observations 76186</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>9999.99</td><td>6</td><td>&lt;.0001</td><td>-0.380</td><td>-0.035</td><td>-0.003</td><td>-0.013</td><td>-0.010</td><td>-0.003</td><td></td><td></td></tr><tr><td>12</td><td>9999.99</td><td>12</td><td>&lt;.0001</td><td>-0.000</td><td>0.002</td><td>-0.002</td><td>0.002</td><td>-0.002</td><td>0.002</td><td></td><td></td></tr><tr><td>18</td><td>9999.99</td><td>18</td><td>&lt;.0001</td><td>-0.000</td><td>0.003</td><td>0.001</td><td>-0.003</td><td>0.005</td><td>0.001</td><td></td><td></td></tr><tr><td>24</td><td>9999.99</td><td>24</td><td>&lt;.0001</td><td>-0.001</td><td>0.000</td><td>0.002</td><td>0.006</td><td>-0.002</td><td>-0.002</td><td></td><td></td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	9999.99	6	<.0001	-0.380	-0.035	-0.003	-0.013	-0.010	-0.003			12	9999.99	12	<.0001	-0.000	0.002	-0.002	0.002	-0.002	0.002			18	9999.99	18	<.0001	-0.000	0.003	0.001	-0.003	0.005	0.001			24	9999.99	24	<.0001	-0.001	0.000	0.002	0.006	-0.002	-0.002			<div>Trend and Correlation Analysis for ret</div>
To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----																																																										
6	9999.99	6	<.0001	-0.380	-0.035	-0.003	-0.013	-0.010	-0.003																																																					
12	9999.99	12	<.0001	-0.000	0.002	-0.002	0.002	-0.002	0.002																																																					
18	9999.99	18	<.0001	-0.000	0.003	0.001	-0.003	0.005	0.001																																																					
24	9999.99	24	<.0001	-0.001	0.000	0.002	0.006	-0.002	-0.002																																																					
MUR	<div><div>The SAS System 19:11 Wednesday, June 7, 2017</div><div>Security symbol root=MUR</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series 1.359E-7</div><div>Standard Deviation 0.000306</div><div>Number of Observations 21320</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>942.12</td><td>6</td><td>&lt;.0001</td><td>-0.207</td><td>-0.029</td><td>-0.014</td><td>0.003</td><td>-0.005</td><td>0.006</td><td></td><td></td></tr><tr><td>12</td><td>964.84</td><td>12</td><td>&lt;.0001</td><td>-0.018</td><td>-0.007</td><td>-0.023</td><td>0.009</td><td>0.003</td><td>0.009</td><td></td><td></td></tr><tr><td>18</td><td>972.73</td><td>18</td><td>&lt;.0001</td><td>0.003</td><td>-0.013</td><td>0.013</td><td>-0.000</td><td>-0.003</td><td>0.004</td><td></td><td></td></tr><tr><td>24</td><td>987.64</td><td>24</td><td>&lt;.0001</td><td>-0.005</td><td>0.012</td><td>-0.008</td><td>-0.016</td><td>0.014</td><td>0.002</td><td></td><td></td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	942.12	6	<.0001	-0.207	-0.029	-0.014	0.003	-0.005	0.006			12	964.84	12	<.0001	-0.018	-0.007	-0.023	0.009	0.003	0.009			18	972.73	18	<.0001	0.003	-0.013	0.013	-0.000	-0.003	0.004			24	987.64	24	<.0001	-0.005	0.012	-0.008	-0.016	0.014	0.002			<div>Trend and Correlation Analysis for ret</div>
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NDAQ	<div><div>The SAS System 19:11 Wednesday, June 7, 2017</div><div>Security symbol root=NDAQ</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series -2.67E-7</div><div>Standard Deviation 0.000208</div><div>Number of Observations 33957</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>1976.77</td><td>6</td><td>&lt;.0001</td><td>-0.240</td><td>-0.028</td><td>0.038</td><td>-0.008</td><td>0.005</td><td>0.008</td><td></td><td></td></tr><tr><td>12</td><td>2117.33</td><td>12</td><td>&lt;.0001</td><td>-0.040</td><td>0.045</td><td>0.009</td><td>-0.002</td><td>0.022</td><td>0.008</td><td></td><td></td></tr><tr><td>18</td><td>2131.28</td><td>18</td><td>&lt;.0001</td><td>-0.014</td><td>0.008</td><td>-0.006</td><td>0.003</td><td>-0.008</td><td>0.006</td><td></td><td></td></tr><tr><td>24</td><td>2163.08</td><td>24</td><td>&lt;.0001</td><td>-0.005</td><td>0.022</td><td>-0.001</td><td>-0.007</td><td>0.013</td><td>-0.015</td><td></td><td></td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	1976.77	6	<.0001	-0.240	-0.028	0.038	-0.008	0.005	0.008			12	2117.33	12	<.0001	-0.040	0.045	0.009	-0.002	0.022	0.008			18	2131.28	18	<.0001	-0.014	0.008	-0.006	0.003	-0.008	0.006			24	2163.08	24	<.0001	-0.005	0.022	-0.001	-0.007	0.013	-0.015			<div>Trend and Correlation Analysis for ret</div>
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PDCO	<div><div>The SAS System19:11 Wednesday, June 7, 2017</div><div>----- Security symbol root=PDCO -----</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series1.186E-6</div><div>Standard Deviation0.000281</div><div>Number of Observations14213</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>1422.40</td><td>6</td><td>&lt;.0001</td><td>-0.315</td><td>-0.007</td><td>-0.009</td><td>0.021</td><td>-0.014</td><td>-0.001</td></tr><tr><td>12</td><td>1455.36</td><td>12</td><td>&lt;.0001</td><td>0.041</td><td>-0.015</td><td>-0.013</td><td>-0.005</td><td>0.013</td><td>0.003</td></tr><tr><td>18</td><td>1457.61</td><td>18</td><td>&lt;.0001</td><td>0.003</td><td>-0.004</td><td>-0.009</td><td>0.003</td><td>-0.006</td><td>0.001</td></tr><tr><td>24</td><td>1467.39</td><td>24</td><td>&lt;.0001</td><td>-0.002</td><td>-0.006</td><td>-0.014</td><td>0.009</td><td>-0.007</td><td>-0.018</td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	1422.40	6	<.0001	-0.315	-0.007	-0.009	0.021	-0.014	-0.001	12	1455.36	12	<.0001	0.041	-0.015	-0.013	-0.005	0.013	0.003	18	1457.61	18	<.0001	0.003	-0.004	-0.009	0.003	-0.006	0.001	24	1467.39	24	<.0001	-0.002	-0.006	-0.014	0.009	-0.007	-0.018	<div><div>Trend and Correlation Analysis for ret</div><div></div></div>
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TXN	<div><div>The SAS System19:11 Wednesday, June 7, 20177</div><div>----- Security symbol root=TXN -----</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series1.047E-7</div><div>Standard Deviation0.000145</div><div>Number of Observations118525</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>9999.99</td><td>6</td><td>&lt;.0001</td><td>-0.309</td><td>-0.025</td><td>0.004</td><td>-0.001</td><td>0.009</td><td>0.002</td></tr><tr><td>12</td><td>9999.99</td><td>12</td><td>&lt;.0001</td><td>-0.003</td><td>0.007</td><td>0.004</td><td>0.000</td><td>-0.007</td><td>-0.008</td></tr><tr><td>18</td><td>9999.99</td><td>18</td><td>&lt;.0001</td><td>0.026</td><td>-0.013</td><td>-0.005</td><td>0.002</td><td>0.003</td><td>-0.010</td></tr><tr><td>24</td><td>9999.99</td><td>24</td><td>&lt;.0001</td><td>0.005</td><td>0.002</td><td>-0.004</td><td>-0.003</td><td>0.007</td><td>-0.005</td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	9999.99	6	<.0001	-0.309	-0.025	0.004	-0.001	0.009	0.002	12	9999.99	12	<.0001	-0.003	0.007	0.004	0.000	-0.007	-0.008	18	9999.99	18	<.0001	0.026	-0.013	-0.005	0.002	0.003	-0.010	24	9999.99	24	<.0001	0.005	0.002	-0.004	-0.003	0.007	-0.005	<div><div>Trend and Correlation Analysis for ret</div><div></div></div>
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UTX	<div><div>The SAS System19:11 Wednesday, June 7, 2017</div><div>----- Security symbol root=UTX -----</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series1.61E-7</div><div>Standard Deviation0.000174</div><div>Number of Observations53829</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>5985.10</td><td>6</td><td>&lt;.0001</td><td>-0.331</td><td>-0.032</td><td>0.009</td><td>-0.012</td><td>0.000</td><td>0.021</td></tr><tr><td>12</td><td>6010.52</td><td>12</td><td>&lt;.0001</td><td>-0.013</td><td>-0.002</td><td>0.015</td><td>-0.008</td><td>-0.003</td><td>0.001</td></tr><tr><td>18</td><td>6020.14</td><td>18</td><td>&lt;.0001</td><td>0.010</td><td>0.002</td><td>-0.008</td><td>0.001</td><td>0.005</td><td>-0.002</td></tr><tr><td>24</td><td>6040.66</td><td>24</td><td>&lt;.0001</td><td>0.010</td><td>-0.010</td><td>0.000</td><td>0.012</td><td>-0.005</td><td>-0.003</td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	5985.10	6	<.0001	-0.331	-0.032	0.009	-0.012	0.000	0.021	12	6010.52	12	<.0001	-0.013	-0.002	0.015	-0.008	-0.003	0.001	18	6020.14	18	<.0001	0.010	0.002	-0.008	0.001	0.005	-0.002	24	6040.66	24	<.0001	0.010	-0.010	0.000	0.012	-0.005	-0.003	<div><div>Trend and Correlation Analysis for ret</div><div></div></div>
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WYNN	<div><div>The SAS System19:11 Wednesday, June 7, 2017</div><div>----- Security symbol root=WYNN -----</div><div>The ARIMA Procedure</div><div>Name of Variable = ret</div><div>Mean of Working Series-1.59E-6</div><div>Standard Deviation0.000409</div><div>Number of Observations38054</div><div>Autocorrelation Check for White Noise</div><table><thead><tr><th>To Lag</th><th>Chi-Square</th><th>DF</th><th>Pr &gt; ChiSq</th><th colspan="8">-----Autocorrelations-----</th></tr></thead><tbody><tr><td>6</td><td>4241.84</td><td>6</td><td>&lt;.0001</td><td>-0.333</td><td>-0.011</td><td>-0.015</td><td>-0.002</td><td>0.011</td><td>0.005</td></tr><tr><td>12</td><td>4323.65</td><td>12</td><td>&lt;.0001</td><td>0.004</td><td>-0.015</td><td>0.015</td><td>-0.019</td><td>0.029</td><td>-0.022</td></tr><tr><td>18</td><td>4477.11</td><td>18</td><td>&lt;.0001</td><td>0.031</td><td>-0.042</td><td>0.030</td><td>-0.011</td><td>0.016</td><td>0.003</td></tr><tr><td>24</td><td>4523.64</td><td>24</td><td>&lt;.0001</td><td>0.008</td><td>-0.021</td><td>-0.001</td><td>0.019</td><td>-0.005</td><td>0.018</td></tr></tbody></table></div>	To Lag	Chi-Square	DF	Pr > ChiSq	-----Autocorrelations-----								6	4241.84	6	<.0001	-0.333	-0.011	-0.015	-0.002	0.011	0.005	12	4323.65	12	<.0001	0.004	-0.015	0.015	-0.019	0.029	-0.022	18	4477.11	18	<.0001	0.031	-0.042	0.030	-0.011	0.016	0.003	24	4523.64	24	<.0001	0.008	-0.021	-0.001	0.019	-0.005	0.018	<div><div>Trend and Correlation Analysis for ret</div><div></div></div>
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### Interpretation:

- We only consider to the lag from 1 to 12.
- As can be seen from all tables and figures above, there is a common trend across all stocks. The p-value is smaller than the significant level of 0.05. Hence, there is a strong evidence against the null hypothesis. In another words, we can reject the null hypothesis under the significant level of 0.05.
- Besides, from the figures, we can observe that the original variables are not stationary. Look at the ACF and PACF, the ACF tails off and PACF cuts off after lag 1, this may suggest us to use AR(1) model. However, the optimize p value for AR can be estimated later.

### For problem (b) and (c), I will analyse each stock one by one

- b) Choose the appropriate lags for building ARIMA model based on the SCAN and ESACF methods.
  - Data trade used for this analysis is already processed from problem 1, this data satisfies all the conditions of trading.
  - SCAN is done by using:
 

```

proc arima data=trade;
by sym_root;
identify var=ret scan minic; *option scan minic;
run;
quit;

```
  - ESACF is done by using:
 

```

proc arima data=trade;
by sym_root;
identify var=ret esacf minic; *option esacf minic;
run;
quit;

```
- c) Build an ARIMA model for the series:
  - For simplicity, I hereby only consider the model to the difference of 1. In order to compare the performance of SCAN and ESACF method, the values of p and q smaller than 5 will be shown. This is because in some model, the the SCAN and ESACF report the optimal value of (p+d) is between the interval (5, 10).



- **ARIMA(p,0,q)**  
proc arima data=trade;  
by sym\_root;  
identify var=ret;  
estimate p=0 q=3 method=ml;  
*\*using maximum likelihood method and  
setting value for p and q depends on each instance;*  
run;quit;
- **ARIMA(p,1,q)**  
proc arima data=trade;  
by sym\_root;  
identify var=dret; *\*dret is the first order difference of ret*  
estimate p=4 q=5 method=ml; *\*maximum likelihood;  
\*using maximum likelihood method and  
setting value for p and q depends on each instance;*  
run;quit;

### BRCM

SCAN Chi-Square[1] Probability Values							SCAN does not output the ARMA result within the value of 5	Use p+d = 0 and q=5
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5		
AR 0	<.0001	<.0001	<.0001	<.0001	<.0001	0.2024		
AR 1	<.0001	0.0006	0.5260	<.0001	0.0001	0.0009		
AR 2	<.0001	0.0030	<.0001	<.0001	<.0001	0.1361		
AR 3	<.0001	<.0001	<.0001	<.0001	0.0153	0.0290		
AR 4	0.4597	0.6677	0.0014	0.8573	0.0447	0.2844		
AR 5	0.6355	0.5568	0.0128	0.0382	0.1506	0.0426		
ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests  -----ESACF----- p+d                      q                      BIC  	

### ARIMA model

ARIMA(0,0,5)					
Maximum Likelihood Estimation					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	4.35304E-7	3.34978E-7	1.30	0.1938	0
MA1,1	0.29780	0.0036912	80.68	<.0001	1
MA1,2	0.02792	0.0038528	7.25	<.0001	2
MA1,3	0.02057	0.0038523	5.34	<.0001	3
MA1,4	0.01482	0.0038519	3.85	0.0001	4
MA1,5	-0.02465	0.0036922	-6.68	<.0001	5
Constant Estimate			4.353E-7		
Variance Estimate			1.87E-8		
Std Error Estimate			0.000137		
AIC			-1097302		
SBC			-1097247		
Number of Residuals			73364		

### Final model:

ARIMA(0,0,5)

#### Moving Average Factors

Factor 1: 1 - 0.2978 B\*\*(1) - 0.02792 B\*\*(2) - 0.02057 B\*\*(3) - 0.01482 B\*\*(4) + 0.02465 B\*\*(5)

## FMC

SCAN Chi-Square[1] Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC
AR 0	<.0001	<.0001	0.9586	0.0157	0.8787	<.0001	5	5	-16.332
AR 1	<.0001	0.6919	0.0495	0.1211	0.0102	<.0001			
AR 2	<.0001	0.0281	0.1092	0.0480	0.9495	<.0001			
AR 3	<.0001	0.4655	0.0250	0.7153	<.0001	0.0001			
AR 4	<.0001	<.0001	<.0001	<.0001	0.0003	0.0003			
AR 5	<.0001	<.0001	<.0001	0.1190	0.0013	0.9287			

ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC
AR 0	<.0001	<.0001	0.9586	0.0157	0.8794	<.0001	5	5	-16.332
AR 1	<.0001	<.0001	0.9240	0.0099	0.9663	<.0001			
AR 2	<.0001	<.0001	<.0001	0.1453	0.9811	<.0001			
AR 3	<.0001	<.0001	<.0001	0.1990	0.9633	<.0001			
AR 4	<.0001	<.0001	<.0001	0.0017	<.0001	<.0001			
AR 5	<.0001	<.0001	<.0001	<.0001	<.0001	0.5381			

Use p+d = 5  
and q=5 for  
further  
analysis

## ARIMA model

ARIMA(5,0,5)						ARIMA(4,1,5)					
Maximum Likelihood Estimation						The ARIMA Procedure					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag	Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	-5.8363E-7	9.59036E-7	-0.61	0.5428	0	MU	2.7744E-10	4.5409E-10	0.61	0.5412	0
MA1,1	0.06996	0.08252	0.85	0.3965	1	MA1,1	3.18936	0.01721	185.33	<.0001	1
MA1,2	0.07666	0.08563	0.90	0.3706	2	MA1,2	-4.71936	0.03529	-133.72	<.0001	2
MA1,3	0.28396	0.07410	3.83	0.0001	3	MA1,3	4.23661	0.04071	104.07	<.0001	3
MA1,4	0.33973	0.08396	4.05	<.0001	4	MA1,4	-2.16956	0.03050	-71.13	<.0001	4
MA1,5	-0.36832	0.04051	-9.09	<.0001	5	MA1,5	0.46294	0.01003	46.16	<.0001	5
AR1,1	-0.39187	0.08244	-4.75	<.0001	1	AR1,1	1.72575	0.01854	93.10	<.0001	1
AR1,2	-0.14015	0.07340	-1.91	0.0562	2	AR1,2	-1.76432	0.02044	-86.30	<.0001	2
AR1,3	0.20141	0.07283	2.77	0.0057	3	AR1,3	0.94100	0.02062	45.64	<.0001	3
AR1,4	0.42366	0.07732	5.48	<.0001	4	AR1,4	-0.06857	0.01350	-5.08	<.0001	4
AR1,5	-0.14954	0.01320	-11.33	<.0001	5						
Constant Estimate			-6.17E-7			Constant Estimate			4.61E-11		
Variance Estimate			8.184E-8			Variance Estimate			8.175E-8		
Std Error Estimate			0.000286			Std Error Estimate			0.000286		
AIC			-384336			AIC			-384343		
SBC			-384245			SBC			-384260		
Number of Residuals			20511			Number of Residuals			28510		

**Final model:** The model is chosen based on the lowest AIC  
ARIMA(4,1,5)

### Autoregressive Factors

Factor 1:  $1 - 1.72575 B^{**}(1) + 1.76432 B^{**}(2) - 0.941 B^{**}(3) + 0.06857 B^{**}(4)$

### Moving Average Factors

Factor 1:  $1 - 3.18936 B^{**}(1) + 4.71936 B^{**}(2) - 4.23661 B^{**}(3) + 2.16956 B^{**}(4) - 0.46294 B^{**}(5)$

## MRO

SCAN Chi-Square[1] Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC
AR 0	<.0001	<.0001	0.4377	0.0015	0.0111	0.5238	2	2	-16.1862
AR 1	<.0001	0.9995	0.0173	0.3068	0.5483	0.9107	3	1	-16.1866
AR 2	<.0001	0.0065	0.2115	0.2359	0.8319	0.8524	1	3	-16.1863
AR 3	<.0001	0.2342	0.5485	0.9112	0.8493	0.8205	0	5	-16.1866
AR 4	<.0001	0.6580	0.4796	0.8514	0.9890	0.9290			
AR 5	<.0001	0.7320	0.9706	0.7217	0.9274	0.9409			

ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC
AR 0	<.0001	<.0001	0.4377	0.0015	0.0111	0.5238	1	3	-16.1863
AR 1	<.0001	0.9907	0.1360	0.3349	0.2027	0.5579	4	4	-16.1861
AR 2	<.0001	0.9758	<.0001	0.1029	0.3744	0.7857	0	5	-16.1866
AR 3	<.0001	<.0001	<.0001	0.0386	0.0006	0.6450			
AR 4	<.0001	<.0001	<.0001	<.0001	0.8680	0.5261			
AR 5	<.0001	<.0001	0.0160	<.0001	0.0006	0.6244			

p+d=3 and  
q=1/p+d=0  
and q=5 for  
further  
analysis  
(lowest BIC)



## ARIMA model

ARIMA(3,0,1)						ARIMA(2,1,1)					
Maximum Likelihood Estimation						The ARIMA Procedure					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag	Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	2.95855E-7	4.20786E-7	0.70	0.4820	0	MU	2.2293E-11	3.9846E-11	0.56	0.5758	0
MA1,1	0.74499	0.0090432	82.38	<.0001	1	MA1,1	1.00000	0.01951	51.25	<.0001	1
AR1,1	0.23549	0.0090407	24.02	<.0001	1	AR1,1	-0.32000	0.0035809	-89.36	<.0001	1
AR1,2	0.06535	0.0060895	10.73	<.0001	2	AR1,2	-0.13200	0.0035805	-36.86	<.0001	2
AR1,3	0.02823	0.0050902	5.55	<.0001	3						
Constant Estimate			1.985E-7			Constant Estimate			3.24E-11		
Variance Estimate			9.337E-8			Variance Estimate			9.855E-8		
Std Error Estimate			0.000306			Std Error Estimate			0.000314		
AIC			-1016986			AIC			-1012852		
SBC			-1016940			SBC			-1012815		
Number of Residuals			76186			Number of Residuals			76185		

ARIMA(0,0,5)											
Maximum Likelihood Estimation											
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag						
MU	2.96005E-7	4.22511E-7	0.70	0.4836	0						
MA1,1	0.50949	0.0036228	140.64	<.0001	1						
MA1,2	0.05424	0.0040669	13.34	<.0001	2						
MA1,3	0.01685	0.0040695	4.14	<.0001	3						
MA1,4	0.02373	0.0040653	5.84	<.0001	4						
MA1,5	0.01403	0.0036230	3.87	0.0001	5						
Constant Estimate			2.96E-7								
Variance Estimate			9.336E-8								
Std Error Estimate			0.000306								
AIC			-1016992								
SBC			-1016936								
Number of Residuals			76186								

**Final model:** The model is chosen based on the lowest AIC  
ARIMA(0,0,5)

### Moving Average Factors

Factor 1: 1 - 0.50949 B\*\*(1) - 0.05424 B\*\*(2) - 0.01685 B\*\*(3) - 0.02373 B\*\*(4) - 0.01403 B\*\*(5)

## MUR

SCAN Chi-Square[1] Probability Values							ARMA(p,d,q) Tentative Order Selection Tests			Use p+d = 1 and q=1 for further analysis (lowest BIC)
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	-----SCAN-----			
							p+d	q	BIC	
AR 0	<.0001	<.0001	0.0502	0.6278	0.4521	0.4367	1	1	-16.2365	
AR 1	<.0001	0.2312	0.3463	0.4968	0.8766	0.5872	0	2	-16.2364	
AR 2	<.0001	0.3696	0.8747	0.9131	0.6020	0.9492	3	0	-16.2359	
AR 3	0.1214	0.4094	0.9184	0.8867	0.6516	0.2914				
AR 4	0.1580	0.3766	0.5388	0.6684	0.5843	0.7705				
AR 5	0.7978	0.1874	0.0940	0.3136	0.7375	0.8731				
							(5% Significance Level)			
ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests			
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	-----ESACF-----			
							p+d	q	BIC	
AR 0	<.0001	<.0001	0.0503	0.6279	0.4522	0.4368				
AR 1	<.0001	<.0001	0.0013	0.3834	0.8894	0.8676				
AR 2	<.0001	<.0001	0.3398	0.6588	0.8374	0.9908				
AR 3	<.0001	<.0001	<.0001	0.9351	0.7581	0.9637	0	2	-16.2364	
AR 4	<.0001	<.0001	0.0026	0.0348	0.4797	0.6876	2	2	-16.2357	
AR 5	<.0001	<.0001	<.0001	<.0001	<.0001	0.2553				
							(5% Significance Level)			

## ARIMA model

ARIMA(1,0,1)						ARIMA(0,1,1)					
Maximum Likelihood Estimation						The ARIMA Procedure					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag	Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	1.29929E-7	1.48354E-6	0.09	0.9302	0	MU	7.5239E-11	5.5754E-10	0.13	0.8927	0
MA1,1	0.93892	0.02573	15.50	<.0001	1	MA1,1	1.00000	0.09560	10.46	<.0001	1
AR1,1	0.17282	0.02765	6.25	<.0001	1						
Constant Estimate			1.075E-7			Constant Estimate			7.52E-11		
Variance Estimate			8.88E-8			Variance Estimate			9.355E-8		
Std Error Estimate			0.000298			Std Error Estimate			0.000306		
AIC			-285648			AIC			-284531		
SBC			-285624			SBC			-284516		
Number of Residuals			21320			Number of Residuals			21319		

**Final model:** The model is chosen based on the lowest AIC

## ARIMA(1,0,1)

### Autoregressive Factors

Factor 1: 1 - 0.17282 B\*\*(1)

### Moving Average Factors

Factor 1: 1 - 0.39892 B\*\*(1)

## NDAQ

SCAN Chi-Square[1] Probability Values							SCAN does not output the ARMA result within the value of 5	Use p+d = 2 and q=3 for further analysis (lowest BIC)
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5		
AR 0	<.0001	<.0001	<.0001	0.1492	0.3472	0.1448		
AR 1	<.0001	<.0001	<.0001	0.4823	0.1551	0.1648		
AR 2	0.0892	0.6539	0.1443	0.0842	0.2320	0.4859		
AR 3	0.7808	0.2866	0.7434	0.0523	0.0009	0.2639		
AR 4	0.1498	0.6827	0.2885	0.1961	0.6459	0.0082		
AR 5	0.0331	0.0609	0.2150	0.0955	0.3465	<.0001		
ESACF Probability Values								
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5		
AR 0	<.0001	<.0001	<.0001	0.1556	0.3523	0.1490		
AR 1	<.0001	<.0001	<.0001	0.0129	0.5325	0.7758		
AR 2	<.0001	<.0001	<.0001	0.0961	0.2675	0.8734		
AR 3	<.0001	<.0001	0.0768	0.0004	0.2340	0.1848		
AR 4	<.0001	<.0001	0.3315	<.0001	0.1124	0.4917		
AR 5	<.0001	<.0001	<.0001	<.0001	0.4043	<.0001		
ARMA(p+d,q) Tentative Order Selection Tests								
-----ESACF-----								
p+d	q	BIC						
0	3	-17.1218						
2	3	-17.1212						
(5% Significance Level)								

## ARIMA model

ARIMA(0,0,3)					
Maximum Likelihood Estimation					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	-2.6955E-7	8.37541E-7	-0.31	0.7530	0
MA1,1	0.26036	0.0054965	47.37	<.0001	1
MA1,2	0.02074	0.0056802	3.65	0.0003	2
MA1,3	-0.03773	0.0054970	-6.86	<.0001	3
Constant Estimate			-2.64E-7		
Variance Estimate			4.051E-8		
Std Error Estimate			0.000201		
AIC			-468875		
SBC			-468841		
Number of Residuals			33057		

## Final model:

ARIMA(0,0,3)

### Moving Average Factors

Factor 1: 1 - 0.26036 B\*\*(1) - 0.02074 B\*\*(2) + 0.03773 B\*\*(3)

## PDCO

SCAN Chi-Square[1] Probability Values							SCAN does not output the ARMA result within the value of 5	Use p+d = 0 and q=4 for further analysis (lowest BIC)
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5		
AR 0	<.0001	0.4733	0.3056	0.0206	0.1316	0.9061		
AR 1	<.0001	0.3262	0.1656	0.1305	0.2359	0.0971		
AR 2	<.0001	0.0214	0.1171	0.8860	0.0564	0.0426		
AR 3	0.7346	0.2119	0.2730	0.0511	0.2463	0.8793		
AR 4	0.1947	0.6979	0.2565	0.0518	0.9359	0.1520		
AR 5	0.3546	0.2450	0.6513	<.0001	0.0148	0.0107		
ESACF Probability Values								
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5		
AR 0	<.0001	0.4752	0.3068	0.0220	0.1348	0.9069		
AR 1	<.0001	<.0001	0.5463	0.1060	0.1248	0.9680		
AR 2	<.0001	<.0001	<.0001	0.8268	0.6057	0.5060		
AR 3	<.0001	<.0001	<.0001	0.3980	0.5762	0.9511		
AR 4	<.0001	<.0001	0.0002	<.0001	0.5915	0.9680		
AR 5	<.0001	<.0001	0.0713	<.0001	0.6488	<.0001		
ARMA(p+d,q) Tentative Order Selection Tests								
-----ESACF-----								
p+d		q		BIC				
1		2		-16.5823				
0		4		-16.5852				
(5% Significance Level)								

**ARIMA model**

ARIMA(0,0,4)					
Maximum Likelihood Estimation					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	1.15948E-6	1.4313E-6	0.81	0.4179	0
MA1,1	0.35947	0.0083899	42.85	<.0001	1
MA1,2	0.01115	0.0089148	1.25	0.2112	2
MA1,3	0.0049941	0.0089136	0.56	0.5753	3
MA1,4	-0.01973	0.0083883	-2.35	0.0187	4
Constant Estimate			1.159E-6		
Variance Estimate			7.018E-8		
Std Error Estimate			0.000265		
AIC			-193700		
SBC			-193743		
Number of Residuals			14213		

**Final model:**

ARIMA(0,0,4)

Moving Average Factors

Factor 1: 1 - 0.35947 B\*\*(1) - 0.01115 B\*\*(2) - 0.00499 B\*\*(3) + 0.01973 B\*\*(4)

**TXN**

SCAN Chi-Square[1] Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC
AR 0	<.0001	<.0001	0.2577	0.8107	0.0029	0.5730	5	1	-17.8034
AR 1	<.0001	0.0996	0.9287	0.2622	0.0670	0.3273	4	4	-17.8033
AR 2	<.0001	0.7043	0.1183	0.0615	0.1055	0.0329	3	5	-17.8033
AR 3	<.0001	0.0031	0.0655	0.0756	0.0205	0.6886			
AR 4	0.6163	0.0442	0.7369	0.0214	0.4336	0.6012			
AR 5	0.0456	0.1938	0.0863	0.1899	0.7806	0.1552			
							(5% Significance Level)		
ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC
AR 0	<.0001	<.0001	0.2578	0.8107	0.0029	0.5735	0	5	-17.8035
AR 1	<.0001	<.0001	0.5119	0.9236	0.0146	0.0481	2	5	-17.8034
AR 2	<.0001	<.0001	0.4980	0.0175	0.0252	0.1044	3	5	-17.8033
AR 3	<.0001	<.0001	<.0001	<.0001	<.0001	0.6900	4	5	-17.8033
AR 4	<.0001	<.0001	<.0001	<.0001	<.0001	0.2721			
AR 5	<.0001	<.0001	<.0001	<.0001	<.0001	<.0001			
							(5% Significance Level)		
							Use p+d = 0 and q=5 for further analysis (lowest BIC)		

**ARIMA model**

ARIMA(0,0,5)					
Maximum Likelihood Estimation					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	1.04499E-7	2.52135E-7	0.41	0.6785	0
MA1,1	0.35846	0.0029045	123.42	<.0001	1
MA1,2	0.02682	0.0030864	8.69	<.0001	2
MA1,3	-0.0052304	0.0030865	-1.69	0.0901	3
MA1,4	-0.0032353	0.0030856	-1.05	0.2944	4
MA1,5	-0.01282	0.0029046	-4.41	<.0001	5
Constant Estimate			1.045E-7		
Variance Estimate			1.863E-8		
Std Error Estimate			0.000136		
AIC			-1773219		
SBC			-1773161		
Number of Residuals			118525		

**Final model:**

ARIMA(0,0,5)

Moving Average Factors

Factor 1: 1 - 0.35846 B\*\*(1) - 0.02682 B\*\*(2) + 0.00523 B\*\*(3) + 0.00324 B\*\*(4) + 0.01282 B\*\*(5)

## UTX

SCAN Chi-Square[1] Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	-----SCAN-----		
AR 0	<.0001	<.0001	0.0599	0.0111	0.9943	<.0001	p+d	q	BIC
AR 1	<.0001	0.0216	0.0158	0.0104	0.0058	0.0001	5	1	-17.4655
AR 2	<.0001	0.0083	0.0171	0.0061	0.3126	0.0054	4	4	-17.465
AR 3	<.0001	0.5529	0.0048	0.1058	0.0031	0.1835	3	5	-17.465
AR 4	<.0001	<.0001	0.0005	0.0104	0.3072	0.5112	(5% Significance Level)		
AR 5	0.0033	0.3476	0.6067	0.0741	0.5587	0.7237			
ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	-----ESACF-----		
AR 0	<.0001	<.0001	0.0600	0.0111	0.9943	<.0001	p+d	q	BIC
AR 1	<.0001	<.0001	0.0002	0.0111	0.9967	<.0001	5	1	-17.4655
AR 2	<.0001	<.0001	<.0001	0.0005	0.5912	0.0003	4	4	-17.465
AR 3	<.0001	<.0001	<.0001	<.0001	0.9919	0.0471	3	5	-17.465
AR 4	<.0001	<.0001	<.0001	<.0001	<.0001	0.0016	(5% Significance Level)		
AR 5	<.0001	<.0001	<.0001	<.0001	<.0001	<.0001			

Use p+d = 5  
and q=1 for  
further  
analysis  
(lowest BIC)

## ARIMA model

ARIMA(5,0,1)						ARIMA(4,1,1)					
Maximum Likelihood Estimation						Maximum Likelihood Estimation					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag	Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
mu	1.62054E-7	3.99456E-7	0.41	0.6850	0	mu	6.1421E-11	2.6589E-11	2.31	0.0209	0
MA1,1	-0.34016	0.15279	-2.23	0.0260	1	MA1,1	1.00000	0.02064	34.91	<.0001	1
AR1,1	-0.73724	0.15279	-4.83	<.0001	1	AR1,1	-0.39497	0.0043068	-91.71	<.0001	1
AR1,2	-0.32783	0.06079	-5.39	<.0001	2	AR1,2	-0.18959	0.0046206	-41.03	<.0001	2
AR1,3	-0.15020	0.02946	-5.10	<.0001	3	AR1,3	-0.07923	0.0046204	-17.15	<.0001	3
AR1,4	-0.07812	0.01296	-6.03	<.0001	4	AR1,4	-0.04035	0.0043066	-9.37	<.0001	4
AR1,5	-0.03752	0.0065574	-5.72	<.0001	5						
Constant Estimate			3.777E-7			Constant Estimate			1.05E-10		
Variance Estimate			2.598E-8			Variance Estimate			2.6E-8		
Std Error Estimate			0.000161			Std Error Estimate			0.000161		
AIC			-787400			AIC			-787345		
SBC			-787338			SBC			-787291		
Number of Residuals			53829			Number of Residuals			53828		

**Final model:** The model is chosen based on the lowest AIC  
ARIMA(5,0,1)

### Autoregressive Factors

Factor 1: 1 + 0.73724 B\*\*(1) + 0.32783 B\*\*(2) + 0.1502 B\*\*(3) + 0.07812 B\*\*(4) + 0.03752 B\*\*(5)

### Moving Average Factors

Factor 1: 1 + 0.34016 B\*\*(1)

## WYNN

SCAN Chi-Square[1] Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	-----SCAN-----		
AR 0	<.0001	0.0563	0.0060	0.7365	0.0595	0.3327	p+d	q	BIC
AR 1	<.0001	0.0111	0.4001	0.0431	0.1994	0.8869	3	1	-15.8202
AR 2	<.0001	0.8743	0.0301	0.6302	0.5052	0.3081	2	3	-15.8209
AR 3	<.0001	0.0622	0.2930	0.5026	0.6209	0.7631	0	4	-15.8205
AR 4	0.0011	0.2545	0.7132	0.3226	0.7583	0.6784	5	0	-15.8223
AR 5	0.7393	0.0683	0.0668	0.1690	0.3813	0.5522	(5% Significance Level)		
ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests		
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	-----ESACF-----		
AR 0	<.0001	0.0598	0.0067	0.7401	0.0632	0.3396	p+d	q	BIC
AR 1	<.0001	<.0001	0.0403	0.5570	0.1769	0.8067	0	3	-15.8207
AR 2	<.0001	<.0001	<.0001	0.3993	0.0929	0.8974	1	3	-15.8209
AR 3	<.0001	<.0001	<.0001	<.0001	0.6377	0.7896	2	3	-15.8209
AR 4	<.0001	<.0001	<.0001	<.0001	<.0001	0.8620	(5% Significance Level)		
AR 5	<.0001	<.0001	<.0001	<.0001	<.0001	<.0001			

Use p+d = 5  
and q=0 for  
further  
analysis  
(lowest BIC)

## ARIMA model

ARIMA(5,0,0)						ARIMA(4,1,0)					
Maximum Likelihood Estimation						Maximum Likelihood Estimation					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag	Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	-1.3814E-6	1.06935E-6	-1.29	0.1964	0	MU	1.32853E-7	5.53593E-7	0.24	0.8103	0
AR1,1	-0.42138	0.0051707	-81.49	<.0001	1	AR1,1	-1.12977	0.0049816	-226.79	<.0001	1
AR1,2	-0.19961	0.0055785	-35.78	<.0001	2	AR1,2	-0.92979	0.0069556	-133.67	<.0001	2
AR1,3	-0.11527	0.0056239	-20.50	<.0001	3	AR1,3	-0.61739	0.0069276	-89.12	<.0001	3
AR1,4	-0.05887	0.0055552	-10.60	<.0001	4	AR1,4	-0.27576	0.0049278	-55.96	<.0001	4
AR1,5	-0.01669	0.0051260	-3.26	0.0011	5						
	Constant Estimate		-2.5E-6				Constant Estimate		5.251E-7		
	Variance Estimate		1.428E-7				Variance Estimate		1.822E-7		
	Std Error Estimate		0.000378				Std Error Estimate		0.000427		
	AIC		-491792				AIC		-482522		
	SBC		-491741				SBC		-482479		
	Number of Residuals		38054				Number of Residuals		38053		

**Final model:** The model is chosen based on the lowest AIC

ARIMA(5,0,0)

Autoregressive Factors

Factor 1: 1 + 0.42138 B\*\*(1) + 0.19961 B\*\*(2) + 0.11527 B\*\*(3) + 0.05887 B\*\*(4) + 0.01669 B\*\*(5)

## ZION

SCAN Chi-Square[1] Probability Values							ARMA(p+d,q) Tentative Order Selection Tests			Use p+d = 5 and q=5 for further analysis
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC	
AR 0	<.0001	<.0001	<.0001	0.1052	<.0001	<.0001	5	5	-17.44	
AR 1	0.0005	<.0001	0.0011	<.0001	0.2186	<.0001				
AR 2	<.0001	0.0007	<.0001	<.0001	<.0001	<.0001				
AR 3	0.4416	<.0001	0.0492	<.0001	0.1532	<.0001				
AR 4	<.0001	0.0023	<.0001	<.0001	<.0001	<.0001				
AR 5	<.0001	<.0001	<.0001	<.0001	0.0401	0.7948				
ESACF Probability Values							ARMA(p+d,q) Tentative Order Selection Tests			
Lags	MA 0	MA 1	MA 2	MA 3	MA 4	MA 5	p+d	q	BIC	
AR 0	<.0001	<.0001	<.0001	0.1109	<.0001	<.0001	5	5	-17.44	
AR 1	<.0001	<.0001	<.0001	0.0838	0.4870	<.0001				
AR 2	<.0001	<.0001	<.0001	0.0035	0.5037	<.0001				
AR 3	<.0001	<.0001	<.0001	<.0001	0.5039	<.0001				
AR 4	<.0001	<.0001	<.0001	<.0001	<.0001	0.0010				
AR 5	<.0001	<.0001	<.0001	<.0001	<.0001	0.4599				

## ARIMA model

ARIMA(5,0,5)						ARIMA(4,1,5)					
Maximum Likelihood Estimation						The ARIMA Procedure					
Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag	Parameter	Estimate	Standard Error	t Value	Approx Pr >  t	Lag
MU	4.35389E-7	8.1509E-7	0.53	0.5932	0	MU	4.1409E-11	3.0135E-10	0.14	0.8907	0
MA1,1	0.20499	0.06969	2.94	0.0033	1	MA1,1	0.11781	0.13050	0.90	0.3667	1
MA1,2	0.06196	0.06150	1.01	0.3137	2	MA1,2	0.28923	0.06591	4.39	<.0001	2
MA1,3	0.44681	0.06044	7.39	<.0001	3	MA1,3	0.76690	0.05648	13.58	<.0001	3
MA1,4	-0.24018	0.06904	-3.48	0.0005	4	MA1,4	0.04334	0.10677	0.41	0.6848	4
MA1,5	-0.26661	0.02769	-9.63	<.0001	5	MA1,5	-0.21729	0.02857	-7.61	<.0001	5
AR1,1	-0.01402	0.06937	-0.20	0.8398	1	AR1,1	-1.09804	0.11921	-9.21	<.0001	1
AR1,2	0.07531	0.06142	1.23	0.2202	2	AR1,2	-0.80896	0.15391	-5.26	<.0001	2
AR1,3	0.43229	0.06123	7.06	<.0001	3	AR1,3	-0.0029221	0.13699	-0.02	0.9830	3
AR1,4	-0.13678	0.06926	-1.97	0.0483	4	AR1,4	0.21338	0.03601	5.93	<.0001	4
AR1,5	-0.32218	0.02277	-14.15	<.0001	5						
	Constant Estimate		4.203E-7				Constant Estimate		1.12E-10		
	Variance Estimate		2.983E-8				Variance Estimate		2.99E-8		
	Std Error Estimate		0.000173				Std Error Estimate		0.000173		
	AIC		-439044				AIC		-438949		
	SBC		-438952				SBC		-438866		
	Number of Residuals		30301				Number of Residuals		30300		

**Final model:** The model is chosen based on the lowest AIC

ARIMA(5,0,5)

Autoregressive Factors

Factor 1: 1 + 0.01402 B\*\*(1) - 0.07531 B\*\*(2) - 0.43229 B\*\*(3) + 0.13678 B\*\*(4) + 0.32218 B\*\*(5)

Moving Average Factors

Factor 1: 1 - 0.20499 B\*\*(1) - 0.06196 B\*\*(2) - 0.44681 B\*\*(3) + 0.24018 B\*\*(4) + 0.26661 B\*\*(5)