

## q1.3

*#The first step is to read the data in a .csv file and convert them to a time series object.*

*#Step 1 read the csv datasets files*

```
data = read.csv("/Users/Bryan/Google Drive/Cours/DSBA/T1/1. Forecasting & Predictive Analysis/6. Project  
tsdata <- xts(data[,2:19], as.Date(data$date))
```

*#We also read the data to set-up the SARIMAX method*

```
Tempdata <- read.csv("/Users/Bryan/Downloads/California_temp_max_min.csv")  
tstemp <- xts(Tempdata[,2:3], as.Date(data$date))  
tstemp1 <- head(tstemp, 1378)  
tstemp2 <- head(tstemp, 1575)  
tstemp3 <- head(tstemp, 1772)
```

As for the previous questions, we split the time series in three different splits: - 70-30 - 80-20 - 90-10

split: 70-30

*#Step 3 perform training and testing data split*

```
train1 <- head(tsdata, 1378)  
test1 <- tail(tsdata, 591)
```

split: 80-20

```
train2 <- head(tsdata, 1575)  
test2 <- tail(tsdata, 394)
```

split: 90-10

```
train3 <- head(tsdata, 1772)  
test3 <- tail(tsdata, 197)
```

For each product, we compute a series of key statistics to assess the accuracy of the forecast methods. The choice of the best method is based on the RMSSE statistics.

###Split1

Let's analyze the forecast for the Hobbies products [Store 1 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	54.3571429	7.800000e+01	56.4196429	39.8161565	55.4586344
## MAPE	0.2100891	2.726595e-01	0.2405174	0.1757254	0.2285218
## MSE	4945.2857143	1.427064e+04	5468.6763393	3234.9517771	4970.7371640
## RMSE	70.3227254	1.194598e+02	73.9504992	56.8766365	70.5034550
## RMSSE	99.4513521	1.689417e+02	104.5817990	80.4357107	99.7069422
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	53.1157180	55.0457955	55.5897899	57.0894035	55.3923781
## MAPE	0.2201403	0.2324053	0.2362762	0.2420746	0.2312666
## MSE	4709.3601882	5103.2523905	5274.9213464	5472.8616663	5090.4149363
## RMSE	68.6247782	71.4370519	72.6286538	73.9787920	71.3471439
## RMSSE	97.0500921	101.0272477	102.7124272	104.6218110	100.9000985

According to the results, the most accurate method is ES.

[Store 2 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	49.0714286	29.2142857	42.625000	30.9214678	42.2142857
## MAPE	0.2817363	0.2072353	0.307797	0.2288556	0.2975545
## MSE	4080.9285714	1467.3571429	2919.569196	1730.6997188	2890.7420166
## RMSE	63.8821460	38.3060980	54.033038	41.6016793	53.7656211
## RMSSE	90.3429972	54.1730033	76.414255	58.8336591	76.0360706
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	39.3439574	38.0892986	38.5258894	8.835999e+01	36.9464727
## MAPE	0.2832598	0.2804215	0.2856923	4.361813e-01	0.2692375
## MSE	2505.1931888	2404.5752100	2448.9304742	1.129221e+04	2309.2920512
## RMSE	50.0519049	49.0364682	49.4866697	1.062648e+02	48.0550939
## RMSSE	70.7840828	69.3480383	69.9847194	1.502811e+02	67.9601656

According to the results, the most accurate methods is ES.

[Store 3 - Train Split 1]

```
## Warning in HoltWinters(train1$Hobbies_CA_3, gamma = FALSE): optimization
## difficulties: ERROR: ABNORMAL_TERMINATION_IN_LNSRCH
```

##	Naive	sNaive	MA	ES	ESX
## MAE	79.9285714	65.2142857	78.4464286	69.1217235	78.6288097
## MAPE	0.2057572	0.1813453	0.2132702	0.1884453	0.2123457
## MSE	8839.1428571	7350.4285714	8066.2053571	7057.1937381	8114.8549118
## RMSE	94.0167158	85.7346404	89.8120557	84.0071053	90.0824895
## RMSSE	132.9597146	121.2470913	127.0134273	118.8039876	127.3958784
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	76.7350859	77.6812518	77.800483	80.0494979	78.2054698
## MAPE	0.2071594	0.2116465	0.212461	0.1998975	0.2121814
## MSE	7820.4312702	7885.8738306	7894.517890	9374.8655385	8032.1547675
## RMSE	88.4332023	88.8024427	88.851100	96.8238893	89.6222895
## RMSSE	125.0634341	125.5856188	125.654430	136.9296574	126.7450572

According to the results, the most accurate method is ES.

Household\_1 products [Store 1 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	64.285714	53.2857143	51.8214286	33.1848687	49.8283049
## MAPE	0.276158	0.2549574	0.3003776	0.1923339	0.2851199
## MSE	6342.071429	4146.0000000	3875.3214286	1756.7947529	3628.2260970
## RMSE	79.637123	64.3894401	62.2520797	41.9141355	60.2347582
## RMSSE	112.623900	91.0604195	88.0377354	59.2755388	85.1848120
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	33.7293893	41.1770980	40.8208258	49.3206435	41.5203418
## MAPE	0.1907465	0.2417248	0.2393842	0.2812415	0.2291935
## MSE	1889.6303045	2543.7414985	2498.1747233	3570.4225497	2480.2304798
## RMSE	43.4698781	50.4355182	49.9817439	59.7530129	49.8019124
## RMSSE	61.4756912	71.3265939	70.6848601	84.5035212	70.4305400

According to the results, the most accurate method is ES.

Household\_1 products [Store 2 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	46.5357143	28.8214286	46.0089286	20.8059164	47.9364649

##	MAPE	0.2658023	0.1971052	0.3289976	0.1599573	0.3537291
##	MSE	3807.3214286	1226.3928571	2948.9531250	614.7531196	3041.3028806
##	RMSE	61.7034961	35.0198923	54.3042643	24.7942154	55.1480089
##	RMSSE	87.2619210	49.5256067	76.7978271	35.0643158	77.9910621
##		ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
##	MAE	20.926090	26.4377810	26.0179000	43.4770355	24.0918386
##	MAPE	0.161011	0.2052971	0.2008676	0.2753458	0.1865159
##	MSE	621.080535	951.6187985	925.8434625	3004.4050075	819.4885877
##	RMSE	24.921487	30.8483192	30.4276759	54.8124530	28.6267111
##	RMSSE	35.244306	43.6261114	43.0312320	77.5165145	40.4842831

According to the results, the most accurate method is ES.

Household\_1 products [Store 3 - Train Split 1]

##		Naive	sNaive	MA	ES	ESX
##	MAE	65.8928571	8.725000e+01	78.1250000	53.9192837	74.3089797
##	MAPE	0.1951851	2.599896e-01	0.2482089	0.1735873	0.2339215
##	MSE	6614.2500000	1.014396e+04	8801.4709821	4768.0883886	8042.3753684
##	RMSE	81.3280394	1.007172e+02	93.8161552	69.0513460	89.6792917
##	RMSSE	115.0152164	1.424357e+02	132.6760791	97.6533501	126.8256707
##		ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
##	MAE	53.8266679	77.5230212	76.0527094	77.9005030	74.993876
##	MAPE	0.1733205	0.2503464	0.2456656	0.2470695	0.242829
##	MSE	4756.7389586	8640.9999556	8347.9017971	8825.5567602	8197.243956
##	RMSE	68.9691160	92.9569791	91.3668528	93.9444344	90.538632
##	RMSSE	97.5370592	131.4610205	129.2122424	132.8574933	128.040962

According to the results, the most accurate method is ARIMA.

Household\_2 products [Store 1 - Train Split 1]

##		Naive	sNaive	MA	ES	ESX	ARIMA
##	MAE	17.5714286	14.5000000	17.7678571	12.1364442	18.5944470	13.4846519
##	MAPE	0.1650825	0.1558081	0.1781828	0.1281334	0.1920563	0.1475105
##	MSE	622.8571429	349.8571429	563.0691964	256.9473226	570.0509831	384.5973382
##	RMSE	24.9571061	18.7044685	23.7290791	16.0295765	23.8757405	19.6111534
##	RMSSE	35.2946779	26.4521131	33.5579855	22.6692445	33.7653960	27.7343591
##		SARIMA	SARIMAX	Holt-Winters	State-Space Model		
##	MAE	13.9094708	14.0272523	18.9367920	13.1622288		
##	MAPE	0.1450196	0.1466106	0.1737656	0.1384406		
##	MSE	346.5864475	349.8832482	683.8674251	294.5297843		
##	RMSE	18.6168324	18.7051663	26.1508590	17.1618701		
##	RMSSE	26.3281768	26.4530999	36.9828994	24.2705494		

According to the results, the most accurate method is ES.

Household\_2 products [Store 2 - Train Split 1]

##		Naive	sNaive	MA	ES	ESX
##	MAE	43.9642857	22.5357143	44.6964286	22.4736936	43.6489950
##	MAPE	0.2780959	0.1862682	0.3656127	0.1953433	0.3494118
##	MSE	3662.0357143	932.9642857	2694.4732143	752.9280673	2685.5981889
##	RMSE	60.5147562	30.5444641	51.9083155	27.4395348	51.8227574
##	RMSSE	85.5807889	43.1963954	73.4094437	38.8053622	73.2884464
##		ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
##	MAE	21.3883903	29.3021411	29.268842	41.7610613	43.1046408
##	MAPE	0.1865448	0.2525749	0.252159	0.3169561	0.3581528

## MSE	768.5134243	1171.2016222	1169.683081	2661.0882259	2505.2704497
## RMSE	27.7220747	34.2228231	34.200630	51.5857367	50.0526767
## RMSSE	39.2049340	48.3983806	48.366995	72.9532484	70.7851743

According to the results, the most accurate method is ES.

Household\_2 products [Store 3 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	44.8928571	36.6785714	29.7767857	22.8013464	31.8969574
## MAPE	0.2474772	0.2319728	0.2032827	0.1608913	0.2214753
## MSE	2849.3928571	1715.0357143	1349.6495536	805.2540184	1521.2183924
## RMSE	53.3797045	41.4129897	36.7375769	28.3769981	39.0027998
## RMSSE	75.4903021	58.5668117	51.9547794	40.1311355	55.1582885
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	31.305867	29.0529101	29.7158536	26.8612905	31.5796376
## MAPE	0.213725	0.2003901	0.2055259	0.1584429	0.2171663
## MSE	1384.234873	1172.5391003	1227.3753372	1324.6536409	1432.2603702
## RMSE	37.205307	34.2423583	35.0339170	36.3957915	37.8452159
## RMSSE	52.616250	48.4260075	49.5454405	51.4714220	53.5212177

According to the results, the most accurate method is ES.

Foods\_1 products [Store 1 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	38.8214286	55.53571	52.6785714	45.1285423	39.2335933
## MAPE	0.3076905	0.43735	0.4729787	0.4097299	0.3161866
## MSE	2467.8214286	4321.60714	3848.3281250	2934.9515498	2462.3380188
## RMSE	49.6771721	65.73893	62.0348944	54.1751931	49.6219510
## RMSSE	70.2541305	92.96889	87.7305890	76.6152929	70.1760361
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	44.7559906	36.304739	36.2570941	40.8553735	1.021316e+02
## MAPE	0.3708893	0.253595	0.2543765	0.3380722	8.583649e-01
## MSE	3160.1296752	2340.236293	2331.0170005	2621.9835521	1.299214e+04
## RMSE	56.2150307	48.375989	48.2806069	51.2053079	1.139831e+02
## RMSSE	79.5000588	68.413979	68.2790890	72.4152408	1.611964e+02

According to the results, the most accurate method is SARIMAX.

Foods\_1 products [Store 2 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	9.678571	12.1785714	10.7767857	11.2213148	12.4238597	11.5126022
## MAPE	0.314042	0.4055122	0.3110257	0.3211465	0.3375342	0.3194484
## MSE	154.250000	222.7500000	200.5424107	180.6739394	256.3182163	222.6057648
## RMSE	12.419742	14.9248116	14.1612998	13.4415006	16.0099412	14.9199787
## RMSSE	17.564168	21.1068709	20.0271022	19.0091525	22.6414759	21.1000362
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		
## MAE	10.6987571	10.3462732	14.7625102	10.1110642		
## MAPE	0.3084829	0.3053186	0.6011497	0.3023364		
## MSE	201.0679648	190.1269179	355.3210397	176.6514301		
## RMSE	14.1798436	13.7886518	18.8499613	13.2910282		
## RMSSE	20.0533271	19.5000984	26.6578709	18.7963523		

According to the results, the most accurate method is Naive.

Foods\_1 products [Store 3 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
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## MAE	48.4642857	56.6071429	50.5051020	53.8413899	50.632961
## MAPE	0.3283988	0.3487272	0.3417891	0.3607933	0.342628
## MSE	3835.3214286	4398.1071429	4064.6581633	4214.2931803	4079.875542
## RMSE	61.9299720	66.3182263	63.7546717	64.9175876	63.873903
## RMSSE	87.5822063	93.7881351	90.1627214	91.8073328	90.331341
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	79.3865958	39.4124942	39.1200030	69.8634878	39.3043401
## MAPE	0.5185128	0.2317317	0.2344859	0.4582895	0.2325712
## MSE	8495.5760984	3032.8914741	2961.1446929	6805.0323385	3022.0542501
## RMSE	92.1714495	55.0716939	54.4164010	82.4926199	54.9732139
## RMSSE	130.3501139	77.8831365	76.9564122	116.6621819	77.7438647

According to the results, the most accurate method is SARIMAX.

Foods\_2 products [Store 1 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	71.1071429	65.7500000	76.4642857	57.3604600	74.3357154
## MAPE	0.2454797	0.2360355	0.2899452	0.2151065	0.2735194
## MSE	6639.3214286	6772.2500000	7821.8214286	5120.6378736	7122.6389282
## RMSE	81.4820313	82.2936814	88.4410619	71.5586324	84.3957281
## RMSSE	115.2329938	116.3808403	125.0745492	101.1991885	119.3535833
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	53.9632651	69.8434893	70.8290802	69.9950806	66.4829839
## MAPE	0.1951979	0.2629011	0.2673829	0.2410301	0.2576901
## MSE	4797.7302902	7084.2636403	7188.2753095	6430.6366348	6524.3436144
## RMSE	69.2656501	84.1680678	84.7836972	80.1912504	80.7734091
## RMSSE	97.9564218	119.0316230	119.9022544	113.4075538	114.2308506

According to the results, the most accurate method is ARIMA.

Foods\_2 products [Store 2 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	44.1785714	33.8214286	37.9017857	28.7120495	39.2330619
## MAPE	0.2699035	0.2304352	0.2751379	0.1985679	0.2641655
## MSE	3135.7500000	1721.0357143	2366.4531250	1269.6643177	2509.7904514
## RMSE	55.9977678	41.4853675	48.6462036	35.6323493	50.0978088
## RMSSE	79.1928027	58.6691693	68.7961209	50.3917517	70.8490007
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	32.6475261	32.089457	32.0378712	46.3638332	33.388439
## MAPE	0.2032032	0.236937	0.2360775	0.2687007	0.230611
## MSE	1684.9420132	1764.430858	1762.2336189	3548.1327811	1872.998278
## RMSE	41.0480452	42.005129	41.9789664	59.5662050	43.278150
## RMSSE	58.0507022	59.404223	59.3672236	84.2393350	61.204547

According to the results, the most accurate method are ES.

Foods\_2 products [Store 3 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	78.2500000	9.289286e+01	8.748214e+01	78.6640257	74.381482
## MAPE	0.1690521	2.329219e-01	2.277452e-01	0.1968181	0.188853
## MSE	9242.9642857	1.207489e+04	1.131519e+04	8905.3223156	8432.081271
## RMSE	96.1403364	1.098858e+02	1.063729e+02	94.3680153	91.826365
## RMSSE	135.9629676	1.554020e+02	1.504340e+02	133.4565271	129.862090
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	75.9032404	70.7501460	73.6118472	70.3262812	76.0911115

## MAPE	0.1975395	0.1829354	0.1907992	0.1708866	0.2012198
## MSE	9038.9599431	8430.3096287	8871.2663374	7188.8736959	9535.3278502
## RMSE	95.0734450	91.8167176	94.1874001	84.7872260	97.6490033
## RMSSE	134.4541553	129.8484473	133.2010986	119.9072450	138.0965449

According to the results, the most accurate method is Holt-Winters.

Foods\_3 products [Store 1 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	3.142143e+02	2.975714e+02	3.337143e+02	2.474804e+02	3.142160e+02
## MAPE	1.799394e-01	1.804373e-01	2.232305e-01	1.582699e-01	1.799391e-01
## MSE	1.536906e+05	1.218054e+05	1.575686e+05	8.514934e+04	1.536937e+05
## RMSE	3.920339e+02	3.490062e+02	3.969491e+02	2.918036e+02	3.920379e+02
## RMSSE	5.544196e+02	4.935694e+02	5.613708e+02	4.126726e+02	5.544253e+02
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	2.398039e+02	2.763032e+02	2.825622e+02	3.153680e+02	3.782797e+02
## MAPE	1.508252e-01	1.906710e-01	1.954770e-01	2.048903e-01	2.465373e-01
## MSE	8.237133e+04	1.074349e+05	1.121610e+05	1.404304e+05	1.762072e+05
## RMSE	2.870041e+02	3.277726e+02	3.349044e+02	3.747404e+02	4.197705e+02
## RMSSE	4.058850e+02	4.635404e+02	4.736264e+02	5.299630e+02	5.936451e+02

According to the results, the most accurate method is ARIMA.

Foods\_3 products [Store 2 - Train Split 1]

##	Naive	sNaive	MA	ES	ESX
## MAE	1.978571e+02	1.136429e+02	1.732143e+02	9.671074e+01	178.564918
## MAPE	2.112836e-01	1.383013e-01	2.052444e-01	1.145648e-01	0.222861
## MSE	6.572779e+04	2.393229e+04	4.699566e+04	1.431955e+04	45197.018259
## RMSE	2.563743e+02	1.547006e+02	2.167848e+02	1.196643e+02	212.595904
## RMSSE	3.625680e+02	2.187797e+02	3.065800e+02	1.692309e+02	300.656010
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	96.330891	1.064705e+02	1.070005e+02	1.845256e+02	1.062356e+02
## MAPE	0.131458	1.289456e-01	1.292186e-01	2.023746e-01	1.282047e-01
## MSE	14777.921605	1.841073e+04	1.850431e+04	5.556429e+04	1.781346e+04
## RMSE	121.564475	1.356861e+02	1.360305e+02	2.357208e+02	1.334671e+02
## RMSSE	171.918129	1.918892e+02	1.923762e+02	3.333595e+02	1.887509e+02

According to the results, the most accurate method is ES.

Foods\_3 products [Store 3 - Train Split 1]

```
## Warning in HoltWinters(train1$Foods_3_CA_3, gamma = FALSE): optimization
## difficulties: ERROR: ABNORMAL_TERMINATION_IN_LNSRCH
```

##	Naive	sNaive	MA	ES	ESX
## MAE	3.302857e+02	3.399286e+02	3.812411e+02	3.062927e+02	3.245826e+02
## MAPE	1.365744e-01	1.557649e-01	1.828465e-01	1.452850e-01	1.348762e-01
## MSE	1.891377e+05	1.630124e+05	1.939883e+05	1.261670e+05	1.832174e+05
## RMSE	4.348997e+02	4.037480e+02	4.404411e+02	3.551999e+02	4.280390e+02
## RMSSE	6.150410e+02	5.709859e+02	6.228777e+02	5.023285e+02	6.053385e+02
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	4.226147e+02	2.815966e+02	2.925361e+02	3.574615e+02	3.255315e+02
## MAPE	2.013011e-01	1.360920e-01	1.416953e-01	1.678431e-01	1.567566e-01
## MSE	2.383890e+05	1.081242e+05	1.156583e+05	1.723777e+05	1.432119e+05
## RMSE	4.882509e+02	3.288225e+02	3.400857e+02	4.151839e+02	3.784334e+02
## RMSSE	6.904911e+02	4.650252e+02	4.809538e+02	5.871587e+02	5.351857e+02

According to the results, the most accurate method is SARIMA.

###SPLIT 2

Let's analyze the forecast for the Hobbies products [Store 1 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	67.9642857	43.9642857	54.7857143	45.3289227	53.593153
## MAPE	0.2028392	0.1215436	0.1538551	0.1279859	0.149212
## MSE	6165.2500000	2808.2500000	4828.7500000	2783.8890245	4803.407693
## RMSE	78.5191060	52.9929241	69.4892078	52.7625722	69.306621
## RMSSE	111.0427845	74.9433119	98.2725801	74.6175452	98.014363
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	50.7964852	52.7809764	54.3782489	54.4038244	53.120950
## MAPE	0.1414285	0.1476754	0.1534397	0.1522085	0.148629
## MSE	4429.5861121	4571.7589542	4629.7700731	4836.5869702	4633.646223
## RMSE	66.5551359	67.6147835	68.0424138	69.5455748	68.070891
## RMSSE	94.1231758	95.6217439	96.2265044	98.3522950	96.266777

According to the results, the most accurate method is ES.

[Store 2 - Train Split 2]

```
## Warning in HoltWinters(train2$Hobbies_CA_2, gamma = FALSE): optimization
## difficulties: ERROR: ABNORMAL_TERMINATION_IN_LNSRCH
```

##	Naive	sNaive	MA	ES	ESX
## MAE	38.9642857	39.1071429	34.1250000	32.1627791	37.6780242
## MAPE	0.1859346	0.1692023	0.1465324	0.1352393	0.1545661
## MSE	2202.0357143	2470.6785714	1956.1674107	1707.3463999	2357.1928189
## RMSE	46.9258534	49.7059209	44.2285814	41.3200484	48.5509302
## RMSSE	66.3631783	70.2947875	62.5486596	58.4353728	68.6613839
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	36.4119437	35.9090165	34.9261302	42.3209351	35.5308594
## MAPE	0.1477808	0.1475944	0.1448727	0.2001765	0.1450859
## MSE	2283.8335340	2112.8382456	2005.8201690	2568.0945522	2108.4449080
## RMSE	47.7894710	45.9656203	44.7863837	50.6763707	45.9178060
## RMSSE	67.5845180	65.0052036	63.3375113	71.6672108	64.9375840

According to the results, the most accurate methods is ES.

[Store 3 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	212.0000000	92.5000000	62.7040816	56.3106664	62.6725977
## MAPE	0.502308	0.197778	0.1409516	0.1260808	0.1410198
## MSE	50690.714286	14753.000000	5912.0204082	5045.9639624	5900.8804750
## RMSE	225.145984	121.461928	76.8896639	71.0349489	76.8171887
## RMSSE	318.404505	171.773106	108.7384054	100.4585881	108.6359100
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	62.5034514	62.8795588	62.9052417	73.1760270	62.2167768
## MAPE	0.1401499	0.1420075	0.1422666	0.1811275	0.1404198
## MSE	5987.8564751	6240.2752347	6232.4094134	8416.3146767	6115.8788846
## RMSE	77.3812411	78.9954127	78.9456105	91.7404746	78.2040848
## RMSSE	109.4336006	111.7163841	111.6459530	129.7406234	110.5972774

According to the results, the most accurate method is ES.

Household\_1 products [Store 1 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	45.3571429	25.6428571	43.5714286	22.86762561	43.679725
## MAPE	0.1607711	0.1034197	0.1623978	0.09012642	0.167944
## MSE	4104.0000000	1052.2142857	3358.6071429	882.35433379	3115.159733
## RMSE	64.0624695	32.4378527	57.9534912	29.70444973	55.813616
## RMSSE	90.5980132	45.8740512	81.9586132	42.00843567	78.932373
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	20.26208578	29.0514179	28.6572417	43.7855291	27.9534701
## MAPE	0.08067055	0.1053254	0.1038367	0.1665578	0.1059966
## MSE	647.18815019	1717.8721901	1692.1498892	3197.1924001	1408.4959914
## RMSE	25.43989289	41.4472217	41.1357495	56.5437211	37.5299346
## RMSSE	35.97744155	58.6152231	58.1747349	79.9648973	53.0753425

According to the results, the most accurate method is ES.

Household\_1 products [Store 2 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	47.7857143	33.857143	50.8214286	37.9103717	53.1609014
## MAPE	0.2261362	0.159944	0.2211329	0.1760816	0.2241918
## MSE	3676.0000000	1787.785714	4519.7834821	2072.4157676	5116.4275304
## RMSE	60.6300256	42.282215	67.2293350	45.5237934	71.5292075
## RMSSE	85.7438044	59.796082	95.0766373	64.3803661	101.1575754
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	39.0815670	37.2945777	38.1963778	55.0117416	40.8495845
## MAPE	0.1808098	0.1545905	0.1589958	0.2283031	0.1722724
## MSE	2208.4347844	2718.9686164	2803.8029271	5571.7666942	3014.5116646
## RMSE	46.9939867	52.1437304	52.9509483	74.6442677	54.9045687
## RMSSE	66.4595333	73.7423707	74.8839492	105.5629357	77.6467857

According to the results, the most accurate method is ES.

Household\_1 products [Store 3 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	75.0714286	48.714286	70.0000000	3.987399e+01	70.7167422
## MAPE	0.1562104	0.105696	0.1656377	8.860516e-02	0.1592467
## MSE	8735.0000000	3544.000000	6575.0334821	2.578277e+03	6601.5162824
## RMSE	93.4612219	59.531504	81.0865802	5.077674e+01	81.2497156
## RMSSE	132.1741276	84.190261	114.6737414	7.180915e+01	114.9044497
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	3.989467e+01	47.6764767	47.5054109	70.806654	54.8491315
## MAPE	8.875159e-02	0.1129098	0.1120038	0.154294	0.1310495
## MSE	2.584727e+03	3474.8166069	3437.1840056	6787.027795	4641.4334211
## RMSE	5.084021e+01	58.9475751	58.6275021	82.383419	68.1280663
## RMSSE	7.189892e+01	83.3644601	82.9118086	116.507749	96.3476354

According to the results, the most accurate method is ES.

Household\_2 products [Store 1 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	23.1428571	25.0000000	23.0446429	12.09601876	22.9970407	14.3517884
## MAPE	0.1647818	0.1754116	0.1657846	0.08562955	0.1662706	0.1005886
## MSE	808.7142857	1015.3571429	788.2120536	329.26432051	779.6355737	370.8727461
## RMSE	28.4379023	31.8646692	28.0751145	18.14564192	27.9219550	19.2580567
## RMSSE	40.2172671	45.0634473	39.7042077	25.66181289	39.4876075	27.2350049
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		



## MAE	15.0156027	14.813002	23.5400784	13.7233731
## MAPE	0.1033185	0.102719	0.1655818	0.1010608
## MSE	431.0991571	413.892411	840.7834228	327.8291043
## RMSE	20.7629275	20.344346	28.9962657	18.1060516
## RMSSE	29.3632136	28.771250	41.0069122	25.6058237

According to the results, the most accurate method is State-Space Model.

Household\_2 products [Store 2 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	33.392857	24.8214286	36.2500000	18.5957010	33.7915110	19.6775469
## MAPE	0.244127	0.1772752	0.2758374	0.1402208	0.2491586	0.1455612
## MSE	1462.750000	944.1785714	1680.6785714	493.1388697	1490.4888649	552.5754329
## RMSE	38.245915	30.7274889	40.9960800	22.2067303	38.6068500	23.5069231
## RMSSE	54.087891	43.4552315	57.9772123	31.4050591	54.5983308	33.2438094
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	24.1281095	24.1233374	32.7055572	31.8037510		
## MAPE	0.1895659	0.1895251	0.2368596	0.2370598		
## MSE	836.9068280	836.6140599	1425.5035870	1338.2428842		
## RMSE	28.9293420	28.9242815	37.7558418	36.5820022		
## RMSSE	40.9122678	40.9051112	53.3948235	51.7347636		

According to the results, the most accurate method is ES.

Household\_2 products [Store 3 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX	
## MAE	34.3928571	25.5357143	21.7142857	16.0062305	19.85288874	
## MAPE	0.1644735	0.1285459	0.1043316	0.0797327	0.09835148	
## MSE	1854.8214286	932.4642857	934.3303571	421.9848422	785.57714292	
## RMSE	43.0676378	30.5362782	30.5668179	20.5422696	28.02814912	
## RMSSE	60.9068375	43.1848188	43.2280084	29.0511563	39.63778861	
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space	Model
## MAE	15.81317089	19.82599282	17.95922127	53.3007854	19.30056664	
## MAPE	0.07879284	0.09373511	0.08519777	0.2639188	0.09687277	
## MSE	421.46760289	810.03855905	707.48075120	3820.3397195	773.39159778	
## RMSE	20.52967615	28.46117635	26.59851032	61.8088968	27.80991905	
## RMSSE	29.03334644	40.25018159	37.61597403	87.4109801	39.32916469	

According to the results, the most accurate method is ARIMA.

Foods\_1 products [Store 1 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	25.1428571	23.4285714	24.5714286	17.5674056	24.8694886	19.9395991
## MAPE	0.1661107	0.1515272	0.1537264	0.1096945	0.1604289	0.1254299
## MSE	1007.0000000	839.9285714	1027.0357143	483.1020626	998.1374563	647.9378927
## RMSE	31.7332633	28.9815212	32.0473979	21.9795829	31.5933135	25.4546242
## RMSSE	44.8776113	40.9860603	45.3218648	31.0838242	44.6796924	35.9982748
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	23.3522290	23.0430583	25.1299725	19.2879506		
## MAPE	0.1341943	0.1326369	0.1664686	0.1151087		
## MSE	1032.1863638	1010.1948081	1006.8706481	686.5248084		
## RMSE	32.1276573	31.7835619	31.7312251	26.2016184		
## RMSSE	45.4353687	44.9487443	44.8747289	37.0546841		

According to the results, the most accurate method is ES.

Foods\_1 products [Store 2 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	61.8214286	65.2500000	64.0803571	65.1998301	64.4124726
## MAPE	0.6265903	0.6701289	0.6404534	0.6801758	0.6430217
## MSE	4853.5357143	5297.1785714	5205.3638393	5123.8336522	5255.3572153
## RMSE	69.6673217	72.7817187	72.1482075	71.5809587	72.4938426
## RMSSE	98.5244712	102.9288936	102.0329735	101.2307626	102.5217754
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	64.0131461	65.6750628	64.4253920	71.9904947	65.5420172
## MAPE	0.6422259	0.6636577	0.6543467	0.7139339	0.6624811
## MSE	5183.9895938	5403.3922844	5214.3362632	6473.1473131	5382.2196087
## RMSE	71.9999277	73.5077702	72.2103612	80.4558718	73.3636123
## RMSSE	101.8232743	103.9556856	102.1208721	113.7817851	103.7518155

According to the results, the most accurate method is Naive.

Foods\_1 products [Store 3 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	35.0714286	35.0714286	32.5714286	24.4596793	33.847148
## MAPE	0.1769381	0.1666142	0.1521452	0.1140372	0.148607
## MSE	1753.3571429	1940.7857143	1509.0714286	849.1191027	1771.936146
## RMSE	41.8731076	44.0543496	38.8467686	29.1396483	42.094372
## RMSSE	59.2175167	62.3022586	54.9376270	41.2096858	59.530432
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	33.057152	33.4614248	33.8337070	33.406543	32.9442979
## MAPE	0.144936	0.1492509	0.1530986	0.147484	0.1530522
## MSE	1675.718868	1681.9722754	1664.1370348	1738.846182	1427.9388977
## RMSE	40.935545	41.0118553	40.7938357	41.699475	37.7880788
## RMSSE	57.891603	57.9995220	57.6911958	58.971963	53.4404135

According to the results, the most accurate method is ES.

Foods\_2 products [Store 1 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	47.8571429	34.2857143	45.3392857	38.1172273	51.02110
## MAPE	0.1812348	0.1264493	0.1655038	0.1411611	0.19876
## MSE	3992.2142857	1829.7142857	4014.8482143	2147.9414624	4137.09919
## RMSE	63.1839717	42.7751597	63.3628299	46.3458894	64.32029
## RMSSE	89.3556298	60.4932110	89.6085734	65.5429853	90.96262
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	46.2196319	33.0038336	34.3225179	64.0768473	40.1117959
## MAPE	0.1830031	0.1210169	0.1292172	0.2157774	0.1431803
## MSE	3208.4886905	2065.1609309	2092.5722241	7395.8631086	3326.2003120
## RMSE	56.6435229	45.4440418	45.7446415	85.9992041	57.6732201
## RMSSE	80.1060384	64.2675802	64.6926924	121.6212408	81.5622500

According to the results, the most accurate method is sNaive.

Foods\_2 products [Store 2 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	52.7500000	45.3928571	44.6696429	42.2208533	37.5279962
## MAPE	0.3081261	0.2643649	0.2600868	0.2608945	0.2244759
## MSE	4584.7500000	3583.7500000	3571.3816964	2887.5159503	2715.6886125
## RMSE	67.7107820	59.8644302	59.7610383	53.7356116	52.1122693
## RMSSE	95.7575062	84.6610891	84.5148708	75.9936307	73.6978780

##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	33.3622941	47.0663244	48.0196449	8.403736e+01	46.2744616
## MAPE	0.2107184	0.2738024	0.2793776	5.058261e-01	0.2711177
## MSE	1968.4319380	3841.8784882	3958.2788078	1.031427e+04	3601.0018360
## RMSE	44.3670141	61.9828887	62.9148536	1.015592e+02	60.0083481
## RMSSE	62.7444330	87.6570418	88.9750393	1.436264e+02	84.8646197

According to the results, the most accurate method are ARIMA.

Foods\_2 products [Store 3 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	52.9642857	66.821429	62.9642857	66.7857148	61.779063
## MAPE	0.1435291	0.171111	0.1569031	0.1717671	0.154357
## MSE	5486.1071429	6703.321429	7424.9352679	6559.5260401	7235.630612
## RMSE	74.0682600	81.873814	86.1680641	80.9909010	85.062510
## RMSSE	104.7483379	115.787058	121.8600449	114.5384306	120.296555
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	50.0363170	48.8097543	52.4417742	75.2518795	47.1358925
## MAPE	0.1391643	0.1294914	0.1461334	0.1860401	0.1287856
## MSE	4843.9602527	4437.0366913	4725.9462882	9819.7756308	4509.4441050
## RMSE	69.5985650	66.6110853	68.7455183	99.0947810	67.1523946
## RMSSE	98.4272346	94.2023003	97.2208444	140.1411833	94.9678272

According to the results, the most accurate method is SARIMA.

Foods\_3 products [Store 1 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	2.662857e+02	1.900000e+02	2.777589e+02	1.578784e+02	2.662884e+02
## MAPE	1.589348e-01	1.122724e-01	1.552550e-01	9.470050e-02	1.589329e-01
## MSE	9.823364e+04	4.763250e+04	1.172704e+05	3.377415e+04	9.823581e+04
## RMSE	3.134225e+02	2.182487e+02	3.424476e+02	1.837775e+02	3.134259e+02
## RMSSE	4.432463e+02	3.086503e+02	4.842941e+02	2.599006e+02	4.432512e+02
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	1.279843e+02	2.155729e+02	2.062093e+02	2.692450e+02	1.530595e+02
## MAPE	7.749751e-02	1.159565e-01	1.138751e-01	1.567061e-01	8.759493e-02
## MSE	2.568688e+04	8.397637e+04	7.329671e+04	1.025619e+05	3.598003e+04
## RMSE	1.602713e+02	2.897868e+02	2.707337e+02	3.202529e+02	1.896840e+02
## RMSSE	2.266578e+02	4.098204e+02	3.828752e+02	4.529059e+02	2.682537e+02

According to the results, the most accurate method is ARIMA.

Foods\_3 products [Store 2 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	2.807500e+02	3.143214e+02	3.242589e+02	3.063748e+02	3.297814e+02
## MAPE	2.442668e-01	2.794303e-01	2.834086e-01	2.775457e-01	2.883768e-01
## MSE	1.356373e+05	1.456908e+05	1.663477e+05	1.310465e+05	1.706843e+05
## RMSE	3.682897e+02	3.816947e+02	4.078575e+02	3.620035e+02	4.131396e+02
## RMSSE	5.208403e+02	5.397978e+02	5.767975e+02	5.119502e+02	5.842676e+02
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	3.094174e+02	3.175641e+02	3.231468e+02	3.864354e+02	3.171199e+02
## MAPE	2.805332e-01	2.757298e-01	2.808408e-01	3.408686e-01	2.756880e-01
## MSE	1.333109e+05	1.579633e+05	1.623191e+05	2.208469e+05	1.567144e+05
## RMSE	3.651177e+02	3.974460e+02	4.028884e+02	4.699435e+02	3.958717e+02
## RMSSE	5.163544e+02	5.620735e+02	5.697703e+02	6.646004e+02	5.598471e+02

According to the results, the most accurate method is ES.

Foods\_3 products [Store 3 - Train Split 2]

##	Naive	sNaive	MA	ES	ESX
## MAE	4.402143e+02	4.416429e+02	4.409375e+02	4.045498e+02	4.473211e+02
## MAPE	1.673452e-01	1.714231e-01	1.676151e-01	1.599891e-01	1.699974e-01
## MSE	3.873889e+05	3.440818e+05	3.881767e+05	2.748383e+05	3.952402e+05
## RMSE	6.224058e+02	5.865848e+02	6.230383e+02	5.242502e+02	6.286813e+02
## RMSSE	8.802147e+02	8.295562e+02	8.811092e+02	7.414017e+02	8.890896e+02
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	3.408927e+02	3.849162e+02	3.609328e+02	3.879008e+02	3.837679e+02
## MAPE	1.376016e-01	1.477447e-01	1.403943e-01	1.473667e-01	1.468221e-01
## MSE	2.185727e+05	2.861612e+05	2.546172e+05	3.265185e+05	2.941080e+05
## RMSE	4.675176e+02	5.349403e+02	5.045960e+02	5.714180e+02	5.423173e+02
## RMSSE	6.611697e+02	7.565199e+02	7.136066e+02	8.081071e+02	7.669524e+02

According to the results, the most accurate method is SARIMA.

###SPLIT 3

Let's analyze the forecast for the Hobbies products [Store 1 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	111.1429	88.92857	81.0000	62.93851	72.26743	75.77718
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	19801.5000	13878.35714	13469.4643	10743.21507	12716.27367	12937.23416
## RMSE	140.7178	117.80644	116.0580	103.64948	112.76646	113.74196
## RMSSE	199.0050	166.60346	164.1308	146.58250	159.47585	160.85543
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		
## MAE	69.61017	69.55544	73.87442	70.60999		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	12407.20708	12402.41062	12724.86410	12545.53058		
## RMSE	111.38764	111.36611	112.80454	112.00683		
## RMSSE	157.52592	157.49546	159.52971	158.40158		

According to the results, the most accurate method is ES.

[Store 2 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	89.03571	76.39286	70.19643	51.25388	69.18121	66.69265
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	13334.96429	10776.96429	8839.06027	6368.25462	8973.91437	8404.38887
## RMSE	115.47712	103.81216	94.01628	79.80134	94.73075	91.67545
## RMSSE	163.30930	146.81256	132.95909	112.85614	133.96951	129.64867
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		
## MAE	63.65393	63.82641	117.1502	74.28737		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	8150.04179	8180.78377	20551.6281	9840.73445		
## RMSE	90.27758	90.44769	143.3584	99.20048		
## RMSSE	127.67178	127.91234	202.7394	140.29066		

According to the results, the most accurate methods is ES.

[Store 3 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	289.6071	122.1786	94.42347	73.58805	96.2344	91.0611
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	99855.8214	23843.3214	16203.19898	12200.85622	16670.0173	16188.7071

## RMSE	315.9997	154.4128	127.29179	110.45749	129.1124	127.2349
## RMSSE	446.8911	218.3727	180.01777	156.21047	182.5925	179.9373
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	89.1230	89.40892	151.1276	92.14837		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	15673.9795	15701.67614	37814.3429	16146.43040		
## RMSE	125.1958	125.30633	194.4591	127.06861		
## RMSSE	177.0535	177.20991	275.0067	179.70214		

According to the results, the most accurate method is ES.

Household\_1 products [Store 1 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	181.0357	67.17857	70.12500	40.90691	61.74697	42.25830
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	37987.4643	7370.10714	7908.25670	3557.32831	6013.01677	3593.82667
## RMSE	194.9037	85.84933	88.92838	59.64334	77.54364	59.94853
## RMSSE	275.6355	121.40928	125.76372	84.34842	109.66327	84.78003
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	54.86457	55.04800	60.70670	87.86568		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	6555.04631	6529.97266	5787.72851	10778.26140		
## RMSE	80.96324	80.80825	76.07712	103.81841		
## RMSSE	114.49931	114.28012	107.58930	146.82140		

According to the results, the most accurate method is ES.

Household\_1 products [Store 2 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	152.9643	54.53571	71.91071	37.62059	63.76931	37.91407
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	29232.5357	6088.39286	7421.63170	3813.60282	6196.16061	3829.76060
## RMSE	170.9752	78.02815	86.14889	61.75437	78.71569	61.88506
## RMSSE	241.7955	110.34847	121.83293	87.33387	111.32080	87.51869
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	52.01599	51.83634	69.85047	52.33722		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	6212.00776	6089.19929	7101.30881	6220.78674		
## RMSE	78.81629	78.03332	84.26926	78.87196		
## RMSSE	111.46307	110.35578	119.17474	111.54180		

According to the results, the most accurate method is ES.

Household\_1 products [Store 3 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	157.2500	93.10714	99.60714	63.15883	83.91093	83.57424
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	34938.3214	15541.46429	16898.10714	9689.46696	13530.25929	12972.39998
## RMSE	186.9180	124.66541	129.99272	98.43509	116.31964	113.89644
## RMSSE	264.3419	176.30351	183.83747	139.20824	164.50082	161.07390
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	95.30046	95.44986	113.6313	108.5055		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	16095.61870	16099.69374	21511.7724	18931.8895		
## RMSE	126.86851	126.88457	146.6689	137.5932		

```
## RMSSE    179.41917    179.44188    207.4212    194.5862
```

According to the results, the most accurate method is ES.

Household\_2 products [Store 1 - Train Split 3]

```
##           Naive      sNaive      MA      ES      ESX      ARIMA      SARIMA
## MAE      41.35714    24.64286    21.72321    19.20813    21.52191    19.91402    19.62197
## MAPE      Inf      Inf      Inf      Inf      Inf      Inf      Inf
## MSE     2642.00000    1183.00000    959.21205    910.24922    937.49024    953.42514    886.39186
## RMSE      51.40039    34.39477    30.97115    30.17034    30.61846    30.87758    29.77233
## RMSSE     72.69113    48.64155    43.79982    42.66730    43.30104    43.66750    42.10444
##           SARIMAX Holt-Winters State-Space Model
## MAE      19.48756    22.96375    18.76992
## MAPE      Inf      Inf      Inf
## MSE      877.80578    990.39274    894.24169
## RMSE      29.62779    31.47051    29.90387
## RMSSE     41.90002    44.50602    42.29046
```

According to the results, the most accurate method is State-Space Model.

Household\_2 products [Store 2 - Train Split 3]

```
##           Naive      sNaive      MA      ES      ESX      ARIMA
## MAE      66.46429    29.39286    43.64286    24.36748    42.41271    23.37228
## MAPE      Inf      Inf      Inf      Inf      Inf      Inf
## MSE     6457.60714    2306.53571    3129.91741    1557.78965    3084.65072    1635.89546
## RMSE      80.35924    48.02641    55.94566    39.46884    55.53963    40.44620
## RMSSE    113.64512    67.91960    79.11912    55.81737    78.54490    57.19957
##           SARIMA      SARIMAX Holt-Winters State-Space Model
## MAE      35.56762    35.37871    41.19858    38.50662
## MAPE      Inf      Inf      Inf      Inf
## MSE     2644.78675    2626.23006    3244.37852    2856.42786
## RMSE      51.42749    51.24676    56.95945    53.44556
## RMSSE     72.72945    72.47386    80.55282    75.58344
```

According to the results, the most accurate method is ES.

Household\_2 products [Store 3 - Train Split 3]

```
##           Naive      sNaive      MA      ES      ESX      ARIMA
## MAE      55.46429    36.39286    27.42857    21.43721    27.06122    29.78660
## MAPE      Inf      Inf      Inf      Inf      Inf      Inf
## MSE     4618.89286    2476.53571    1677.48884    1270.84717    1647.45269    1946.13705
## RMSE      67.96244    49.76480    40.95716    35.64894    40.58882    44.11504
## RMSSE     96.11340    70.37806    57.92217    50.41522    57.40127    62.38809
##           SARIMA      SARIMAX Holt-Winters State-Space Model
## MAE      29.23116    29.66237    33.44576    25.39360
## MAPE      Inf      Inf      Inf      Inf
## MSE     1806.42949    1832.46809    2312.48364    1512.00397
## RMSE      42.50211    42.80734    48.08829    38.88450
## RMSSE     60.10706    60.53872    68.00711    54.99098
```

According to the results, the most accurate method is ES.

Foods\_1 products [Store 1 - Train Split 3]

```
## Warning in HoltWinters(train3$Foods_1_CA_1, gamma = FALSE): optimization
## difficulties: ERROR: ABNORMAL_TERMINATION_IN_LNSRCH
```

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	45.85714	37.07143	32.17857	31.36343	46.28143	25.86119
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	3391.21429	2879.78571	2171.52679	1959.57704	3434.75931	1497.09506
## RMSE	58.23413	53.66363	46.59964	44.26711	58.60682	38.69231
## RMSSE	82.35550	75.89184	65.90185	62.60315	82.88256	54.71919
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		
## MAE	33.84936	33.92131	50.18690		31.32264	
## MAPE	Inf	Inf	Inf		Inf	
## MSE	2366.16097	2383.94575	3840.86822		1942.03546	
## RMSE	48.64320	48.82567	61.97474		44.06853	
## RMSSE	68.79187	69.04992	87.64552		62.32231	

According to the results, the most accurate method is State-Space Model.

Foods\_1 products [Store 2 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	120.5714	37.00000	35.07143	32.02949	32.33146	29.66537
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	16482.5000	3309.78571	2299.27679	2135.72726	2094.64144	1977.77296
## RMSE	128.3842	57.53074	47.95077	46.21393	45.76725	44.47216
## RMSSE	181.5627	81.36075	67.81264	65.35637	64.72467	62.89313
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		
## MAE	46.94073	46.54992	53.20943		38.37670	
## MAPE	Inf	Inf	Inf		Inf	
## MSE	3571.65442	3516.70996	4126.69017		2557.07601	
## RMSE	59.76332	59.30185	64.23932		50.56754	
## RMSSE	84.51810	83.86549	90.84812		71.51330	

According to the results, the most accurate method is ARIMA.

Foods\_1 products [Store 3 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	81.67857	52.25000	52.36224	61.96329	65.06718	106.3816
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	9620.03571	5360.25000	4829.25000	5841.73720	6894.47161	15248.3560
## RMSE	98.08178	73.21373	69.49281	76.43126	83.03295	123.4842
## RMSSE	138.70858	103.53985	98.27767	108.09012	117.42633	174.6331
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		
## MAE	44.14068	44.53646	96.8125		54.43413	
## MAPE	Inf	Inf	Inf		Inf	
## MSE	3613.06267	3673.16008	13066.4385		5089.25778	
## RMSE	60.10876	60.60660	114.3085		71.33903	
## RMSSE	85.00662	85.71068	161.6567		100.88863	

According to the results, the most accurate method is SARIMA.

Foods\_2 products [Store 1 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	83.42857	44.00000	45.11607	42.88572	49.09527	67.27364
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	10313.50000	3574.21429	3986.06920	3956.69119	4693.82862	7288.29452
## RMSE	101.55540	59.78473	63.13532	62.90224	68.51152	85.37151
## RMSSE	143.62103	84.54838	89.28683	88.95719	96.88992	120.73355
##	SARIMA	SARIMAX	Holt-Winters	State-Space Model		

## MAE	66.98894	68.29885	44.81850	51.69597
## MAPE	Inf	Inf	Inf	Inf
## MSE	7317.33579	7522.19735	3640.87810	5123.43973
## RMSE	85.54143	86.73060	60.33969	71.57821
## RMSSE	120.97385	122.65559	85.33321	101.22687

According to the results, the most accurate method is sNaive.

Foods\_2 products [Store 2 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	135.39286	38.392857	46.80357	36.111015	49.625399	38.677889
## MAPE	12.48408	6.902903	8.01502	8.019861	8.316042	8.092171
## MSE	21294.39286	3058.107143	3498.75893	3130.506367	3926.895419	3312.804792
## RMSE	145.92598	55.300155	59.15031	55.950928	62.664946	57.556970
## RMSSE	206.37051	78.206229	83.65117	79.126561	88.621616	81.397848
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	37.400244	37.866543	53.321170	37.54589		
## MAPE	8.116482	8.109598	8.763957	8.03772		
## MSE	2993.742741	3030.560248	4591.252977	2961.22374		
## RMSE	54.715105	55.050524	67.758785	54.41713		
## RMSSE	77.378844	77.853198	95.825393	76.95744		

According to the results, the most accurate method are State-Space Model.

Foods\_2 products [Store 3 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	76.10714	57.96429	61.99107	51.03591	64.16837	87.19561
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	10292.96429	6826.60714	7475.07812	6616.23060	7844.42988	12558.83219
## RMSE	101.45425	82.62328	86.45853	81.34022	88.56879	112.06620
## RMSSE	143.47797	116.84697	122.27083	115.03244	125.25518	158.48553
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	61.19295	62.83679	56.33164	53.86662		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	7397.28128	7686.90641	6290.99329	6016.81328		
## RMSE	86.00745	87.67500	79.31578	77.56812		
## RMSSE	121.63290	123.99118	112.16945	109.69789		

According to the results, the most accurate method is State-Sapce Model.

Foods\_3 products [Store 1 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX	ARIMA
## MAE	419.7857	179.8571	216.0179	209.3329	419.7477	240.9587
## MAPE	Inf	Inf	Inf	Inf	Inf	Inf
## MSE	279646.7857	91413.0000	108466.1942	111985.0978	279612.9058	133835.0751
## RMSE	528.8164	302.3458	329.3421	334.6417	528.7844	365.8348
## RMSSE	747.8593	427.5816	465.7600	473.2549	747.8140	517.3685
##	SARIMA	SARIMAX	Holt-Winters	State-Space	Model	
## MAE	247.3081	252.4713	220.4246	175.1018		
## MAPE	Inf	Inf	Inf	Inf		
## MSE	142314.0949	146456.1151	107719.1028	89934.2770		
## RMSE	377.2454	382.6959	328.2059	299.8904		
## RMSSE	533.5056	541.2137	464.1532	424.1091		

According to the results, the most accurate method is State-Space Model.



Foods\_3 products [Store 2 - Train Split 3]

##	Naive	sNaive	MA	ES	ESX
## MAE	502.67857	192.8929	256.53571	183.20590	259.30807
## MAPE	61.47173	40.4688	43.49416	44.63573	45.16762
## MSE	363603.46429	93418.1071	119326.65179	96973.47452	121270.19753
## RMSE	602.99541	305.6438	345.43690	311.40564	348.23871
## RMSSE	852.76429	432.2455	488.52155	440.39408	492.48390
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	189.29169	205.75622	205.36019	258.61483	207.50787
## MAPE	44.17866	44.99362	44.79353	42.95269	44.52472
## MSE	100604.71449	100934.88326	99507.13567	119814.60700	100779.56830
## RMSE	317.18246	317.70251	315.44752	346.14247	317.45798
## RMSSE	448.56374	449.29919	446.11016	489.51937	448.95338

According to the results, the most accurate method is sNaive.

Foods\_3 products [Store 3 - Train Split 3]

```
## Warning in HoltWinters(train3$Foods_3_CA_3, gamma = FALSE): optimization
## difficulties: ERROR: ABNORMAL_TERMINATION_IN_LNSRCH
```

##	Naive	sNaive	MA	ES	ESX
## MAE	337.1071	190.10714	233.39286	217.94192	326.95138
## MAPE	35.6914	30.69439	31.33143	29.87977	35.36787
## MSE	228952.5357	134659.25000	164120.60714	146086.33306	220203.11202
## RMSE	478.4898	366.95947	405.11802	382.21242	469.25804
## RMSSE	676.6868	518.95905	572.92339	540.52999	663.63109
##	ARIMA	SARIMA	SARIMAX	Holt-Winters	State-Space Model
## MAE	378.61645	308.11894	319.90325	236.56963	261.15173
## MAPE	35.99367	32.93542	33.21269	31.81493	27.12258
## MSE	281407.01510	200793.88149	210077.82846	165276.35788	156983.19729
## RMSE	530.47810	448.10030	458.34248	406.54195	396.21105
## RMSSE	750.20932	633.70953	648.19415	574.93714	560.32704

According to the results, the most accurate method is sNaive.

Save environment variables