Benchmarking the System Performance

```
In []: run_id = '8P_2Predictors_live_training_Horizon30'

In []: os.mkdir(run_id)

In []: dir_= './' + run_id + '/'
```

This Jupyter notebook serves to benchmark the performance of the prototype system.

```
.
```

%run ../tools/dataloader.py %run ../system/activate.py

Loading and importing financial data to forecast and to benchmark the system on

Prophet and Neural prophet training set-up

Loading and importing the system

```
In []:
#training_data = DataLoader('BB', '2818-02-01')
#training_data = training_data.get_adjclose()
```

Normal set-up

```
In [3]: predict = Dataloader('8P', '2018-02-02', '2018-05-01')
predict = predict_get_adjclose()

In [4]: predict_req, real = data_prep(predict, 20, 30) # dividing data into predictor input and real data
```

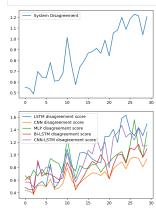
Individual predictor forecasts

in [5]: individual_predictors_forecasts = individual_predictors_pretrained_BP_30_5(predict_req, 30)

In []: #individual_predictors_forecasts = individual_predictors_template2(training_data, 30)

System disagreement between individual predictor forecasts





Building consensus forecast values

In [7]: consensus_forecasts = consensus(individual_predictors_forecasts, real)

In [8]: all_forecasts = combined_frame(individual_predictors_forecasts, consensus_forecasts, real)

[9]: summary = all_stats_frame(all_forecasts, individual_predictors_forecasts) # combining individual predictor forecasts, consensus forecasts and disagreement scores summary

Date 2018-03-31.923475 31.923475 31.923475 32.386080 31.923475 31.923475 31.924553 31.519371 31.760506 32.591705 31.323856 32.421936 0.550122 0.482310 0.434083 0.668230 0.599619 0.566369 31.938124 31.924954 31.931539 31.757072 31.936986 31.939325 31.938725 32.242489 31.636442 31.757072 32.547344 31.274017 32.475746 0.541753 0.446652 0.422526 0.664107 0.566261 31.893625 31.924047 31.917750 32.758286 32.021879 32.073829 32.014092 32.169121 31.613255 31.687441 32.426117 30.983028 32.758286 0.698140 0.532461 0.517624 0.665359 0.910597 0.864660 31.754561 31.728842 32.478863 31.707402 31.980077 0.661937 31.704929 31.855592 32.332169 31.181055 31.469465 32.478863 31.042992 32.352268 0.646873 0.579099 0.521417 0.773934 0.697977 31.807995 31.916507 31.847105 32.616154 31.940875 32.437798 0.712460 32.039121 32.487061 31.448248 31.488953 32.391087 31.095535 32.616154 0.637452 0.500832 0.808158 31.519629 31.637523 31.572197 32.463337 31.706802 32.191348 31.810648 32.242489 30.663185 31.312935 32.463337 30.939068 32.219620 0.780937 0.856444 0.616141 0.943708 0.690914 0.797478 2018-03-14 31.579863 31.667592 31.626876 31.927399 31.676795 32.308544 31.927919 31.688131 31.227610 31.342339 32.475788 30.926178 31.927399 0.607841 0.472826 0.449880 0.895926 0.653685 0.566892 2018-03-15 31.450956 31.448347 31.493605 31.815842 31.464976 31.558912 31.771015 31.818569 30.915678 31.368473 32.312157 30.842632 31.815842 0.564497 0.473938 0.563411 0.614274 31.537523 31.509489 32.144428 31.513220 31.823631 0.681920 0.819005 0.633478 31 518098 31 709773 31 602633 32 796539 31 854923 32 242800 31.874897 31.590307 30.426447 31.212103 32.796539 30.779646 32.375755 1 013807 1.091651 0.793240 1 278441 0.879732 1 025971 2018-03-20 31.289978 31.286056 31.351660 31.226955 31.180257 31.368196 0.762853 0.819088 0.614026 0.878612 0.738315 0.764224 31.624308 31.826719 30.470890 31.226955 32.168591 30.605513 31.977943 2018-03-21 31.341291 2018-03-22 31.290078 31.352064 31.345881 32.118462 31.633888 32.659416 31.713879 31.818569 30.260265 31.102762 32.118462 31.036943 31.931955 0.737825 1.029812 0.550642 0.828384 0.563805 0.716480 2018-03-23 31.220284 1.037714 31.345045 31.289614 32.091583 31.338356 31.746853 31.649147 31.891941 30.182570 31.077864 31.951736 30.797665 32.091583 0.795536 0.612617 0.787392 0.668657 0.871300 31.127776 31.068869 31.575846 31.173715 31.651936

	Average	NoMemory	Memory	Focus	Anchor	Correcting	Correcting Memory	Real Value	LSTM	CNN	MLP	BI-LSTM	CNN- LSTM	System Disagreement	LSTM disagreement score	CNN disagreement score	MLP disagreement score	BI-LSTM disagreement score	CNN-LSTM disagreement score
Date																			
2018-03- 27	30.991722	31.069494	31.077738	32.007824	31.326844	32.956946	31.520689	32.584892	30.059404	31.033098	31.739635	30.118649	32.007824	0.882852	0.932318	0.713881	0.855189	0.896771	1.016102
2018-03- 28	31.098504	31.200603	31.186990	32.363129	31.464359	32.697094	31.688726	32.283257	30.201876	31.004501	31.651840	30.271175	32.363129	0.912507	0.896629	0.708384	0.837851	0.855049	1.264624
2018-03- 29	30.732746	30.854468	30.818474	31.789845	30.917406	31.905036	31.348037	33.049572	29.947014	30.961243	31.237888	29.727739	31.789845	0.866414	0.873442	0.670596	0.725925	1.005006	1.057099
2018-04- 02	30.813956	30.883732	30.907776	32.018658	31.320879	33.135751	31.514494	32.535973	29.522015	30.967358	31.372194	30.189558	32.018658	0.988148	1.291942	0.735856	0.816823	0.891416	1.204701
2018-04- 03	30.789407	30.880111	30.863710	31.531679	31.019582	32.514893	31.540262	33.188171	29.493404	30.615656	31.665564	30.640734	31.531679	0.841655	1.296003	0.622652	0.876156	0.617636	0.795826
2018-04- 04	30.748893	30.822428	30.846589	31.492891	31.326696	33.141128	31.569900	33.449039	29.341408	30.591784	31.492891	30.282539	32.035843	1.055876	1.407485	0.780957	0.961179	0.842806	1.286950
2018-04- 05	30.760904	30.842903	30.863953	32.113972	31.259546	33.462260	31.663106	34.174595	29.561840	30.684181	31.546734	29.897791	32.113972	1.080513	1.199063	0.840215	1.012725	0.997493	1.353068
2018-04- 06	30.582997	30.656782	30.692662	32.051628	31.297157	33.973812	31.582306	34.044163	29.001944	30.550428	31.357599	29.953386	32.051628	1.200573	1.581054	0.890779	1.052214	1.010188	1.468631
2018-04- 09	30.504671	30.579248	30.601103	31.785673	31.100878	33.960328	31.602153	33.962635	28.874775	30.590141	31.126215	30.146553	31.785673	1.088233	1.629897	0.778112	0.885327	0.866830	1.281002
2018-04- 10	30.522241	30.593659	30.631038	31.867661	31.147720	33.981554	31.708107	34.875694	29.143154	30.449364	31.555641	29.595385	31.867661	1.185483	1.379087	0.936953	1.158208	1.107748	1.345420
2018-04- 11	30.623361	30.688446	30.727688	31.638863	31.464581	34.991236	31.930497	35.103962	29.319021	30.288361	32.182137	29.688425	31.638863	1.228267	1.304340	0.962711	1.558775	1.082698	1.232811
2018-04- 12	30.384334	30.446524	30.492463	31.265465	31.169320	34.833575	31.793960	35.103962	28.948793	30.507416	31.265465	29.394670	31.805326	1.213418	1.435541	0.945465	1.097075	1.168015	1.420992
2018-04- 13	30.394420	30.447162	30.484766	31.532990	31.126277	35.122263	31.922249	35.022434	29.088953	30.421045	31.261431	29.667683	31.532990	1.037091	1.305467	0.807557	0.975634	0.958229	1.138569
2018-04- 16	30.418459	30.471119	30.517966	31.419561	31.324423	35.045613	32.047520	34.826790	28.925261	30.379860	31.781141	29.586473	31.419561	1.207176	1.493199	0.937794	1.362682	1.096471	1.145734

In []: summary.to_csv(dir_ + run_id + '_Forecast_Summary.csv')

Absolute error analysis of individual predictors and consensus forecasts

n [10]: prediction_error = absolute_error_analytics(individual_predictors_forecasts, consensus_forecasts, real)

Out[10]:

pred	prediction_error																	
	LSTM absolute error	CNN absolute error	MLP absolute error	BI-LSTM absolute error	CNN-LSTM absolute error	Average absolute error	NoMemory absolute error	Memory absolute error	Focus absolute error	Anchor absolute error	Correcting absolute error	Correcting Memory absolute error	LSTM disagreement score	CNN disagreement score	MLP disagreement score	BI-LSTM disagreement score	CNN-LSTM disagreement score	System Disagreement
2018																		
03-05	0.405182	0.164047	0.667152	0.600697	0.497383	0.001078	0.001078	0.001078	0.001078	0.461527	0.001078	0.001078	0.482310	0.434083	0.668230	0.599619	0.566369	0.550122
2018- 03-06	0.606047	0.485416	0.304855	0.968472	0.233257	0.304364	0.317535	0.310950	0.485416	0.305503	0.303164	0.303764	0.446652	0.422526	0.609220	0.664107	0.566261	0.541753
2018- 03-07	0.627119	0.524916	0.577984	0.451406	0.123569	0.180378	0.142042	0.176766	0.123569	0.105802	0.124722	0.077927	0.446741	0.385419	0.758361	0.370718	0.485713	0.489391
2018- 03-08	0.555866	0.481680	0.256996	1.186092	0.589165	0.275496	0.245074	0.251370	0.589165	0.147242	0.095292	0.155028	0.532461	0.517624	0.665359	0.910597	0.864660	0.698140
2018- 03-09	1.151114	0.862703	0.146694	1.289177	0.020100	0.627240	0.577607	0.603327	0.146694	0.624767	0.352091	0.476576	0.579099	0.521417	0.773934	0.661937	0.697977	0.646873
2018- 03-12	1.038813	0.998108	0.095974	1.391525	0.129093	0.679065	0.570553	0.639956	0.129093	0.546186	0.049263	0.447939	0.500832	0.492691	0.673118	0.712460	0.808158	0.637452
2018- 03-13	1.579304	0.929554	0.220848	1.303421	0.022869	0.722860	0.604965	0.670292	0.220848	0.535686	0.051141	0.431840	0.856444	0.616141	0.943708	0.690914	0.797478	0.780937
2018-	0.460522	0.345793	0.787657	0.761953	0.239267	0.108269	0.020539	0.061255	0.239267	0.011336	0.620413	0.239788	0.472826	0.449880	0.895926	0.653685	0.566892	0.607841
2018-	0.902891	0.450096	0.493587	0.975937	0.002728	0.367613	0.370223	0.324964	0.002728	0.353593	0.259657	0.047554	0.564497	0.473938	0.861200	0.608324	0.563411	0.614274
2018-	1.547935	0.801195	0.015797	1.238724	0.041000	0.728930	0.647906	0.675940	0.041000	0.672209	0.361797	0.404843	0.819005	0.545972	0.713134	0.633478	0.698011	0.681920
2018-	1.163860	0.378204	1.206232	0.810661	0.785448	0.072209	0.119465	0.012326	1.206232	0.264616	0.652493	0.284590	1.091651	0.793240	1.278441	0.879732	1.025971	1.013807
2018-	1.355829	0.599764	0.341871	1.221207	0.151224	0.536741	0.540663	0.475059	0.599764	0.646462	0.458524	0.202411	0.819088	0.614026	0.878612	0.738315	0.764224	0.762853
2018-	2.116499	1.709694	0.750729	1.449625	0.843603	1.374030	1.305432	1.335662	0.843603	1.354391	0.831198	1.019560	0.742469	0.498386	0.623301	0.446372	0.567577	0.575621
2018-	1.558304	0.715807	0.299892	0.781626	0.113386	0.528492	0.466505	0.472689	0.299892	0.184681	0.840846	0.104691	1.029812	0.550642	0.828384	0.563805	0.716480	0.737825
2018-	1.709372	0.814077	0.059795	1.094276	0.199642	0.671658	0.546896	0.602327	0.199642	0.553585	0.145088	0.242794	1.037714	0.612617	0.787392	0.668657	0.871300	0.795536
2018-	2.974009	1.951670	1.375898	2.634499	0.891445	1.965504	1.823968	1.882875	1.375898	1.778029	1.299809	1.525514	1.008504	0.668233	0.783387	0.804799	1.074059	0.867796
2018-	2.525488	1.551794	0.845257	2.466244	0.577068	1.593170	1.515398	1.507155	0.577068	1.258048	0.372054	1.064204	0.932318	0.713881	0.855189	0.896771	1.016102	0.882852
2018-	2.081381	1.278755	0.631416	2.012081	0.079872	1.184752	1.082654	1.096266	0.079872	0.818898	0.413837	0.594531	0.896629	0.708384	0.837851	0.855049	1.264624	0.912507
2018-	3.102558	2.088329	1.811684	3.321833	1.259727	2.316826	2.195104	2.231098	1.259727	2.132166	1.144536	1.701535	0.873442	0.670596	0.725925	1.005006	1.057099	0.866414
2018-	3.013958	1.568615	1.163778	2.346415	0.517315	1.722016	1.652240	1.628197	0.517315	1.215094	0.599779	1.021478	1.291942	0.735856	0.816823	0.891416	1.204701	0.988148
2018-	3.694767	2.572515	1.522608	2.547438	1.656492	2.398764	2.308061	2.324462	1.656492	2.168589	0.673279	1.647910	1.296003	0.622652	0.876156	0.617636	0.795826	0.841655
2018-	4.107632	2.857256	1.956148	3.166500	1.413197	2.700146	2.626611	2.602451	1.956148	2.122343	0.307911	1.879139	1.407485	0.780957	0.961179	0.842806	1.286950	1.055876
2018-	4.612755	3.490414	2.627861	4.276804	2.060623	3.413691	3.331692	3.310642	2.060623	2.915049	0.712335	2.511489	1.199063	0.840215	1.012725	0.997493	1.353068	1.080513
2018-	5.042219	3.493734	2.686563	4.090776	1.992535	3.461166	3.387381	3.351501	1.992535	2.747006	0.070351	2.461856	1.581054	0.890779	1.052214	1.010188	1.468631	1.200573
2018- 04-09	5.087860	3.372494	2.836420	3.816082	2.176962	3.457964	3.383387	3.361532	2.176962	2.861757	0.002307	2.360482	1.629897	0.778112	0.885327	0.866830	1.281002	1.088233
2018-	5.732540	4.426331	3.320053	5.280310	3.008034	4.353453	4.282035	4.244656	3.008034	3.727975	0.894140	3.167587	1.379087	0.936953	1.158208	1.107748	1.345420	1.185483
2018-	5.784941	4.815601	2.921825	5.415537	3.465099	4.480601	4.415516	4.376274	3.465099	3.639381	0.112726	3.173465	1.304340	0.962711	1.558775	1.082698	1.232811	1.228267
2018- 04-12	6.155169	4.596546	3.838497	5.709291	3.298635	4.719628	4.657438	4.611499	3.838497	3.934642	0.270387	3.310002	1.435541	0.945465	1.097075	1.168015	1.420992	1.213418
2018- 04-13	5.933481	4.601389	3.761003	5.354752	3.489445	4.628014	4.575273	4.537668	3.489445	3.896157	0.099829	3.100185	1.305467	0.807557	0.975634	0.958229	1.138569	1.037091
2018- 04-16	5.901529	4.446930	3.045649	5.240316	3.407228	4.408331	4.355671	4.308824	3.407228	3.502367	0.218823	2.779270	1.493199	0.937794	1.362682	1.096471	1.145734	1.207176
"																		

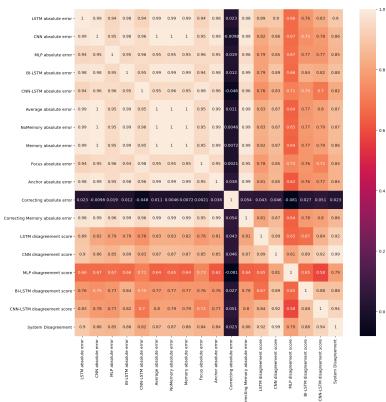
In []: prediction_error.to_csv(dir_ + run_id + '_Prediction_Errors.csv')

Correlation matrix of individual predictor and consensus forecast absolute errors

n [11]: correlation_ = correlation(prediction_error, True) correlation_

| LSTM | CNN | MLP | Bi-LSTM | Substitute | absolute |

	LSTM absolute error	CNN absolute error	MLP absolute error	BI-LSTM absolute error	CNN-LSTM absolute error	Average absolute error	NoMemory absolute error	Memory absolute error	Focus absolute error	Anchor absolute error	Correcting absolute error	Correcting Memory absolute error	LSTM disagreement score	CNN disagreement score	MLP disagreement score	BI-LSTM disagreement score	CNN-LSTM disagreement score	System Disagreement
CNN absolute																		
error	0.986546	1.000000	0.945150	0.984096	0.960660	0.996181	0.996198	0.996528	0.953444	0.989250	-0.009799	0.991348	0.816564	0.863372	0.665693	0.749178	0.776664	0.857036
MLP absolute error	0.942621	0.945150	1.000000	0.947023	0.961911	0.949725	0.953967	0.950207	0.957350	0.954191	0.018853	0.959329	0.793374	0.845573	0.669340	0.768156	0.771782	0.849600
BI-LSTM absolute error	0.976250	0.984096	0.947023	1.000000	0.948429	0.990890	0.991013	0.990596	0.943222	0.984531	0.011809	0.986858	0.794551	0.888447	0.659049	0.838447	0.821017	0.879721
CNN-LSTM absolute error	0.936080	0.960660	0.961911	0.948429	1.000000	0.952606	0.957339	0.954455	0.984279	0.958603	-0.047630	0.955455	0.757337	0.827759	0.710140	0.751168	0.695104	0.820016
Average absolute error	0.992264	0.996181	0.949725	0.990890	0.952606	1.000000	0.999650	0.999919	0.946220	0.993336	0.011479	0.992708	0.829347	0.870172	0.639577	0.770873	0.796508	0.866211
NoMemory absolute error	0.991802	0.996198	0.953967	0.991013	0.957339	0.999650	1.000000	0.999698	0.951196	0.993740	0.004591	0.992561	0.828724	0.871760	0.646864	0.772953	0.793984	0.867350
Memory absolute error	0.991141	0.996528	0.950207	0.990596	0.954455	0.999919	0.999698	1.000000	0.947432	0.993742	0.007241	0.992861	0.824625	0.865739	0.637077	0.767541	0.790973	0.861502
Focus absolute error	0.936052	0.953444	0.957350	0.943222	0.984279	0.946220	0.951196	0.947432	1.000000	0.949436	0.002051	0.952543	0.779846	0.851470	0.728670	0.764883	0.719931	0.843334
Anchor absolute error	0.982435	0.989250	0.954191	0.984531	0.958603	0.993336	0.993740	0.993742	0.949436	1.000000	0.037634	0.992561	0.806937	0.853088	0.620464	0.756845	0.770624	0.843483
Correcting absolute error	0.022540	-0.009799	0.018853	0.011809	-0.047630	0.011479	0.004591	0.007241	0.002051	0.037634	1.000000	0.054074	0.042943	0.045909	-0.080951	0.026737	0.050599	0.023281
Correcting Memory absolute error	0.981353	0.991348	0.959329	0.986858	0.955455	0.992708	0.992561	0.992861	0.952543	0.992561	0.054074	1.000000	0.808686	0.865786	0.640714	0.777121	0.796213	0.860096
LSTM disagreement score	0.890949	0.816564	0.793374	0.794551	0.757337	0.829347	0.828724	0.824625	0.779846	0.806937	0.042943	0.808686	1.000000	0.892705	0.645558	0.673759	0.843224	0.921158
CNN disagreement score	0.900468	0.863372	0.845573	0.888447	0.827759	0.870172	0.871760	0.865739	0.851470	0.853088	0.045909	0.865786	0.892705	1.000000	0.807879	0.886099	0.921585	0.991497
MLP disagreement score	0.662237	0.665693	0.669340	0.659049	0.710140	0.639577	0.646864	0.637077	0.728670	0.620464	-0.080951	0.640714	0.645558	0.807879	1.000000	0.653296	0.582766	0.789677
BI-LSTM disagreement score	0.764497	0.749178	0.768156	0.838447	0.751168	0.770873	0.772953	0.767541	0.764883	0.756845	0.026737	0.777121	0.673759	0.886099	0.653296	1.000000	0.877749	0.882392
CNN-LSTM disagreement score	0.826366	0.776664	0.771782	0.821017	0.695104	0.796508	0.793984	0.790973	0.719931	0.770624	0.050599	0.796213	0.843224	0.921585	0.582766	0.877749	1.000000	0.939581
System Disagreement	0.901757	0.857036	0.849600	0.879721	0.820016	0.866211	0.867350	0.861502	0.843334	0.843483	0.023281	0.860096	0.921158	0.991497	0.789677	0.882392	0.939581	1.000000
											- 1.0							

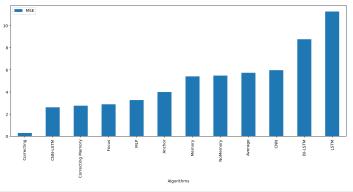


In []: correlation_to_csv(dir_ + run_id + '_Error_Correlation.csv')

MSE, MSE log and MAE scores

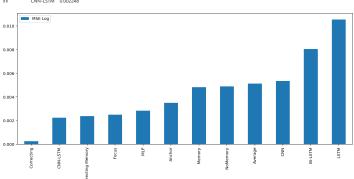
In [12]: mse = mse_score(all_forecasts, True) mse

t[12]:		Algorithms	MSE
	0	Average	5.736552
	1	NoMemory	5.477071
	2	Memory	5.416116
	3	Focus	2.886259
	4	Anchor	3.983440
	5	Correcting	0.285209
	6	Correcting Memory	2.750885
	7	LSTM	11.273420
	8	CNN	5.967228
	9	MLP	3.259404
	10	BI-LSTM	8.766272
	11	CNN-LSTM	2.618390



```
In []: mse_log = mse_log_score(all_forecasts, True) mse_log = mse_log = mse_log score(all_forecasts, True) mse_log = mse_log score(all_forecasts, True) mse_log score(all_forecasts, True)
```

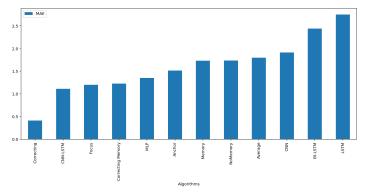
0	Average	0.005129
1	NoMemory	0.004883
2	Memory	0.004826
3	Focus	0.002491
4	Anchor	0.003494
5	Correcting	0.000252
6	Correcting Memory	0.002373
7	LSTM	0.010552
8	CNN	0.005346
9	MLP	0.002833
10	BI-LSTM	0.008051
11	CNN-LSTM	0.002248



```
In []: mse_log.to_csv(dir_ + run_id + '_MSE_log_score.csv')

In [14]: mae = mae_score(all_forecasts, True)
mae
```

ut[14]:		Algorithms	MAE
	0	Average	1.799415
	1	NoMemory	1.735630
	2	Memory	1.732969
	3	Focus	1.199631
	4	Anchor	1.516170
	5	Correcting	0.411296
	6	Correcting Memory	1.224634
	7	LSTM	2.750965
	8	CNN	1.912448
	9	MLP	1.352358
	10	BI-LSTM	2.440123
	11	CNN-LSTM	1.109514



In []: mae.to_csv(dir_ + run_id + '_MAE_score.csv')

Performance plotting of all forecasting algorithms

In [15]: plot_performance(all_forecasts)



