

```
In [3]: %config InlineBackend.figure_format = 'retina'
import pandas as pd
import os
```

Benchmarking the System Performance

```
In [1]: run_id = "BP_20predictors_live_training_Horizon30"

In [2]: os.mkdir(run_id)

In [3]: dir_ = "." + run_id + "/"
```

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

Loading and importing the system

```
In [2]: %run ../system/activate.py
```

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

Prophet and Neural prophet training set-up

```
In [1]: #training_data = DataLoader("BP", "2018-02-01", "2018-02-01")
#training_data = training_data.get_adjclose()
```

Normal set-up

```
In [4]: # Alternative DataLoader data retrieval through the Investry python library from investing.com
# predict = AlternativeDataLoader("US", "United States", "01/05/2018", "01/05/2018", "stock")
# predict = AlternativeDataLoader("S&P 500", "United States", "01/02/2018", "01/05/2018", "index")
# predict = AlternativeDataLoader("BP", "United States", "01/02/2018", "01/05/2018", "stock")
# predict = predict.get_adjclose()

predict = DataLoader("BP", "2018-02-01", "2018-05-01")
predict = predict.get_adjclose()

[*****] 1 of 1 completed

In [5]: predict_req, real = data_prep(predict, 20, 30) # dividing data into predictor input and real data
```

Individual predictor forecasts

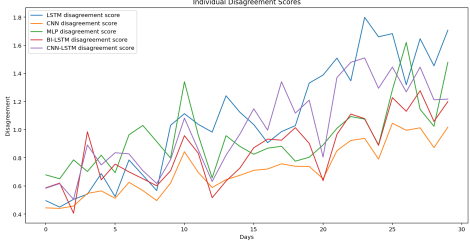
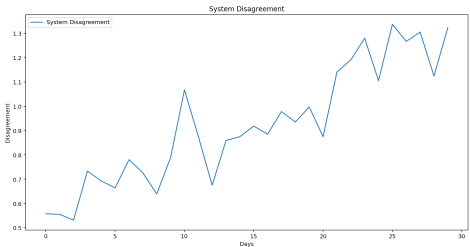
```
In [6]: individual_predictors_forecasts = IndividualPredictors.get_trained_BP_30_5(predict_req, 30)

WARNING:tensorflow:5 out of the last 5 calls to function Model.add_loss() resulted in TFException: triggered tf.function retracing. Tracing is expensive and the excessive number of tracings could be due to (1) creating @tf.function repeatedly in a loop, (2) passing tensors with different shapes, (3) passing Python objects instead of tensors. For (1), please define your @tf.function outside of the loop. For (2), @tf.function has experimental_relax_shapes=True option that relaxes argument shapes that can avoid unnecessary retracing. For (3), please refer to https://www.tensorflow.org/tutorials/customization/performance/python_or_tensor_args and https://www.tensorflow.org/api_guides/python/tf.function for more details.

In [7]: #individual_predictors_forecasts = IndividualPredictors.template2(training_data, 30)
```

System disagreement between individual predictor forecasts

```
In [7]: system_disagreement = IndividualPredictors.forecasts
```



Building consensus forecast values

```
In [8]: consensus_forecasts = consensus(IndividualPredictors.forecasts, real)
```

Only using correcting consensus algorithm:

```
In [7]: #consensus_forecasts = consensus_optimal(IndividualPredictors.forecasts, real)
```

all_forecasts = combined_frame(individual_predictors_forecasts, consensus_forecasts, real)

```
In [10]: summary = all_stats_frame(all_forecasts, IndividualPredictors.forecasts) # combining individual predictor forecasts, consensus forecasts and disagreement scores
summary
```

Date	Average	NoMemory	Memory	Focus	Anchor	Correcting	Correcting Memory	Real Value	LSTM	CNN	MLP	Bi-LSTM	CNN-LSTM	System	LSTM disagreement score	LSTM disagreement score	CNN disagreement score	MLP disagreement score	Bi-LSTM disagreement score	CNN-LSTM disagreement score
2018-03-02	32.057995	32.057995	32.057995	32.057995	32.523025	32.057995	32.057995	31.549149	31.623466	31.880047	32.736618	31.471310	32.576533	0.557709	0.495191	0.444075	0.678623	0.586885	0.583772	0.891133
2018-03-05	32.065960	31.953417	32.009688	31.729818	31.986336	31.557295	31.811627	31.924553	31.729818	31.777794	32.176793	31.445732	32.659660	0.602027	0.555514	0.449776	0.640181	0.650834	0.602027	0.616554
2018-03-06	32.022451	31.957288	31.967708	31.597425	32.030640	31.628466	31.807039	32.242489	31.571956	31.5917425	32.807880	31.849337	32.339657	0.531533	0.504495	0.456813	0.785429	0.406431	0.530645	0.804856

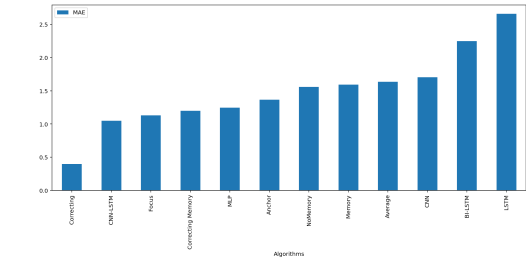
	Average	NoMemory	Memory	Focus	Anchor	Correcting	Correcting Memory	Real Value	LSTM	CNN	MLP	Bi-LSTM	CNN-LSTM	System	disagreement score	disagreement score	disagreement score	disagreement score	Bi-LSTM	CNN-LSTM
Date																				
2018-03-07	32.012259	32.043612	31.972258	32.903393	32.150193	32.232560	31.904189	32.046844	31.784128	31.757584	32.589111	31.027081	32.903393	0.733464	0.541568	0.546877	0.702365	0.985179	0.891133	
2018-03-08	31.812527	31.797720	31.773545	31.124746	31.774269	31.848728	31.733468	32.169121	31.124746	31.982314	32.631039	31.198761	32.515774	0.693276	0.687780	0.546461	0.818512	0.643372	0.749353	
2018-03-09	31.950656	32.004453	31.932180	32.786556	32.033747	32.310114	31.944751	32.332169	31.580156	31.640572	32.500377	31.195620	32.786556	0.644335	0.524314	0.512231	0.694189	0.755037	0.835900	
2018-03-12	31.626331	31.700479	31.614635	32.589863	31.746764	32.02638	31.673673	32.487061	30.841606	31.352814	32.589863	30.983175	32.364197	0.780406	0.784725	0.625856	0.963532	0.699783	0.828152	
2018-03-13	31.828548	31.747339	31.634263	32.658768	31.796463	32.490786	31.778594	32.24489	30.952355	31.415283	32.658768	30.993832	32.12601	0.726687	0.667902	0.567056	0.930220	0.651347	0.708200	
2018-03-14	31.546650	31.622090	31.559809	31.965233	31.621198	32.160704	31.748977	31.688131	31.002180	31.358093	32.461731	30.945511	31.966233	0.639279	0.567137	0.495855	0.915081	0.601139	0.617183	
2018-03-15	31.525586	31.548476	31.543126	32.305202	31.583087	31.665548	31.720125	31.818569	30.494377	31.475905	32.327350	31.033895	32.305202	0.788840	1.031209	0.602076	0.798164	0.707918	0.787035	
2018-03-16	31.626559	31.709768	31.653871	31.343279	31.858671	31.915399	31.826004	32.185429	30.512856	31.343279	32.967461	30.773546	32.535656	1.067411	1.137304	0.843343	1.340891	0.952790	1.081818	
2018-03-19	31.356893	31.441041	31.387309	32.14757	31.363830	31.916536	31.587692	31.590307	30.319023	31.346593	32.317341	30.661686	32.14757	0.876593	1.037870	0.696078	0.960448	0.832272	0.856297	
2018-03-20	31.465942	31.489794	31.482564	31.139688	31.426624	31.706601	31.702513	31.826719	30.483341	31.139688	32.122837	30.502070	32.080875	0.675229	0.982601	0.586793	0.656885	0.516137	0.631718	
2018-03-21	31.941775	31.464986	31.574109	32.067471	31.555598	31.697884	31.582528	32.715221	30.100700	31.094524	32.299019	31.146860	32.062471	0.859133	1.241014	0.644720	0.957304	0.624253	0.818275	
2018-03-22	31.252287	31.362438	31.293482	32.075035	31.495334	32.622329	31.567057	31.818569	30.128309	31.047588	32.075035	30.789753	32.220471	0.875223	1.123978	0.675543	0.881030	0.727112	0.968454	
2018-03-23	31.080245	31.193901	31.130309	31.689701	31.238644	31.643388	31.408890	31.891941	30.044018	31.119741	31.689701	30.318862	32.228882	0.918488	1.036227	0.711137	0.825129	0.671309	0.946637	
2018-03-26	31.116398	31.252966	31.195957	31.890999	31.218937	31.329617	31.477395	32.951744	30.225798	31.196623	31.890999	30.183403	31.134938	0.865220	0.907558	0.720592	0.932995	0.832995	0.996666	
2018-03-27	31.178338	31.273386	31.237885	32.519054	31.627690	31.015941	31.617862	32.584892	30.192274	31.132256	31.754548	30.293339	32.519054	0.978334	0.986604	0.757562	0.880204	0.825305	1.340716	
2018-03-28	30.816196	30.947747	30.880984	31.933883	31.030711	32.207245	31.301695	32.283257	29.787560	31.183582	31.364401	29.811543	31.933883	0.935284	1.028636	0.739838	0.776002	1.014246	1.117698	
2018-03-29	30.914125	31.040578	30.984008	32.124378	31.259434	32.386250	31.449929	33.049572	29.582930	31.119732	31.447124	30.256463	32.124378	0.997369	1.331196	0.738422	0.803901	0.903076	1.210253	
2018-04-02	30.941407	31.075130	30.985892	31.688742	31.253734	33.083454	31.555980	32.559973	29.552906	30.782200	31.832544	30.850641	31.688742	0.874531	1.388501	0.650924	0.891138	0.637236	0.804856	
2018-04-03	30.873331	30.994473	30.954268	31.642401	31.333478	32.406005	31.526010	31.188171	29.364027	30.847815	31.642401	30.268072	32.247519	1.141201	1.508724	0.880066	1.009613	0.966645	1.370428	
2018-04-04	30.833676	30.947730	30.919701	32.312386	31.290732	31.144441	31.556393	31.440319	29.486235	30.819382	31.670305	29.880072	32.312386	1.190806	1.347441	0.932727	1.093462	1.111139	1.478710	
2018-04-05	30.697345	30.809799	30.791249	32.207317	31.260293	31.289956	31.494302	31.743951	28.899019	30.798977	31.482540	30.098873	32.207317	1.280042	1.798326	0.938393	1.075106	1.078414	1.509972	
2018-04-06	30.623234	30.703797	30.703442	31.916775	31.194879	34.096999	31.527841	34.044163	28.962044	30.738535	31.246233	30.248035	31.916775	1.105226	1.660281	0.790586	0.891215	0.888846	1.294500	
2018-04-09	30.539360	30.623273	30.637005	31.984367	31.226203	33.946336	31.532984	33.962635	28.856272	30.525064	31.715170	29.515295	31.984367	1.336971	1.683088	1.045594	1.283489	1.227674	1.445008	
2018-04-10	30.709633	30.865348	30.854888	31.803997	31.420704	34.223707	31.861706	34.875694	29.450188	30.438219	32.389729	29.765036	31.803997	1.266887	1.319446	0.935700	1.062095	1.130537	1.286856	
2018-04-11	30.472913	30.547651	30.589338	31.417479	31.219012	34.541549	31.661917	35.103962	28.826012	30.760489	31.417479	29.440587	31.917637	1.305303	1.646801	1.013303	1.146429	1.276956	1.444724	
2018-04-12	30.449667	30.512887	30.531574	31.662251	31.185459	35.084633	31.760243	35.103962	28.995661	30.588392	31.348377	29.653656	31.662251	1.244644	1.454007	0.872262	1.024259	1.059209	1.212583	
2018-04-13	30.489672	30.551635	30.580917	31.532991	31.434076	35.144562	31.909419	35.022434	28.782688	30.533643	31.968452	29.628898	31.532991	1.321419	1.706994	1.018034	1.478780	1.199445	1.217503	

```
In [1]: summary_to_csv(dir_ + run_id + "_Forecast_Summary.csv")
```

Absolute error analysis of individual predictors and consensus forecasts

```
In [11]: prediction_error = absolute_error_analytics(individual_predictors_forecasts, consensus_forecasts, real)
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
Date																		
2018-03-02	0.073917	0.130498	1.187069	0.078229	0.120984	0.508446	0.508446	0.508446	0.508446	0.973476	0.508446	0.508446	0.493191	0.444075	0.678623	0.586885	0.583772	0.557709
2018-03-05	0.194735	0.146739	0.792240	0.478821	0.735107	0.141407	0.028864	0.085135	0.194735	0.061983	0.367238	0.112326	0.449776	0.440181	0.650834	0.602027	0.616554	0.555514
2018-03-06	0.724533	0.645063	0.565392	0.393152	0.097168	0.220038	0.285200	0.274721	0.645063	0.211849	0.319643	0.435450	0.504495	0.456813	0.785429	0.406431	0.504495	0.531533
2018-03-07	0.262716	0.285261	0.542267	1.019764	0.855458	0.034585	0.032323	0.074587	0.855458	0.103348	0.185716	0.142656	0.541568	0.546877	0.702365	0.985179	0.891133	0.733464
2018-03-08	1.044274	0.578007	0.461918	0.979360	0.356594	0.371400	0.395578	1.044274	0.394852	0.320393	0.094444	0.536562	0.687780	0.546461	0.818512	0.643372	0.749353	0.733464
2018-03-09	0.752012	0.691597	0.218208	1.136549	0.446638	0.381512	0.374075	0.399988	0.446638	0.296421	0.022054	0.387418	0.524134	0.510231	0.649193	0.603737	0.839000	0.664335
2018-03-12	1.645454	1.134247	0.102862	1.503885	0.122864	0.860730	0.786582	0.872425	0.102862	0.740297	0.484423	0.813388	0.784725	0.623856	0.936332	0.699783	0.828132	0.780406
2018-03-13	1.290234	0.827206	0.416279	1.248637	0.119988	0.613941	0.495150	0.680826	0.416279	0.446026	0.242898	0.448395	0.676292	0.567056	1.000220	0.651347	0.708020	0.726687
2018-03-14	0.680951	0.329538	0.779600	0.742620	0.277102	0.141482	0.066041	0.128322	0.277102	0.064933	0.242878	0.060846	0.567137	0.491855	0.915081	0.601139	0.617835	0.493979
2018-03-15	1.324182	0.347654	0.061380	0.784473	0.486633	0.270093	0.279445	0.486633	0.254882	0.153021	0.098844	0.088149	0.400230	0.627016	0.798164	0.707818	0.787103	0.788840
2018-03-16	1.672573	0.842150	0.780352	1.411882	0.350227	0.558869	0.477461	0.531558	0.842150	0.326758	0.227000	0.539425	1.113704	0.843343	1.340091	0.957280	1.081818	1.067411
2018-03-19	1.271238	0.247348	0.727034	0.502621	0.553450	0.231434	0.149356	0.202999	0.553450	0.226477	0.326228	0.002616	1.037870	0.696078	0.950448	0.832222	0.856297	0.876593
2018-03-20	1.143378	0.687031	0.296118	0.323750	0.254156	0.360777	0.328745	0.344155	0.687031	0.400095	0.121018	0.124026	0.826201	0.588793	0.658895	0.516137	0.631718	0.675229
2018-03-21	2.614020	1.620796	0.416302	1.586480	0.647850	1.736360	1.200334	1.341232	0.647850	1.179722	0.170436	1.123752	1.241014	0.644720	0.957394	0.624453	0.818375	0.859133
2018-03-22	1.069280	0.770971	0.256466	0.208816	0.602172	0.566282	0.045131	0.535077	0.256466	0.319235	0.807360	0.025152	1.239878	0.675543	0.881030	0.732122	0.966454	0.875223
2018-03-23	1.847923	0.772200	0.302240	1.573059	0.336941	0.811696	0.688040	0.761632	0.302240	0.663297	0.248553	0.483051	1.036227	0.711137	0.825129	0.887309	1.148637	0.918488
2018-03-26	2.275946	1.791119	1.026245	2.768341	0.838680	1.835346	1.688778	1.782187	1.026245	1.732807	1.022107	1.477749	0.907558	0.720292	0.868287	0.932995	0.946676	0.885220
2018-03-27	2.956118	1.452637	0.893524	2.291353	0.816588	1.406554	1.131106	1.347008	0.893538	0.957203	0.431040	0.967030	0.880664	0.757562	0.880204	0.925205	1.390716	0.978354
2018-03-28	2.499597	1.099764	0.918856	2.477114	0.349363	1.467051	1.335509	1.402273	0.946393	1.253086	0.070108	0.981562	1.028636	0.793883	0.776002	1.014240	1.117698	0.935284
2018-03-29	3.466642	1.928040	1.602448	2.753109	0.925194	2.155447	2.008994	2.065564	0.925194	1.790138	0.663232	1.599643	1.311196	0.738422	0.803901	0.903076	1.212023	0.937369
2018-04-02	2.983067	1.753773	0.703428	1.685331	0.847231	1.594566	1.518443	1.537391	0.847231	1.282238	0.547481	0.979993	1.388051	0.650924	0.891138	0.637236	0.804856	0.874531
2018-04-03	3.823555	2.340357	1.540771	2.920099	1.140542	2.318481	2.191369	2.233903	1.540771	1.854893	0.727566	1.662162	1.508724	1.050206	0.850696	1.009613	0.966645	1.370428
2018-04-04	3.962805	2.426308	1.787734	3.568968	1.136454	2.615364	2.301399	2.293838	1.136454	2.158307	0.304699	1.882546	1.548421	0.932277	1.039432	1.111319	0.980722	1.190806
2018-04-05	5.275576	3.379518	1.620055	4.075222	1.962728	3.477230	3.340136	3.381346	1.962728	2.805302	0.867569	2.460833	1.798626	0.938933	1.075106	1.078414	1.509972	1.200042



```
In [ 3]: save_to_csv(df_ + row_id + "_RMSE_accns.csv")
```

Performance plotting of all forecasting algorithms

```
In [10]: plot_performance(all_forecasts)
```

