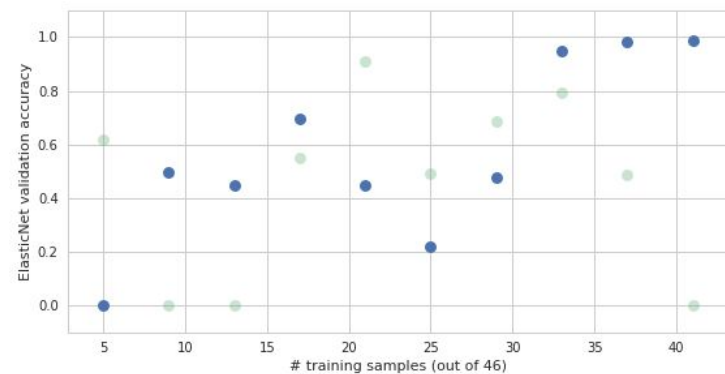
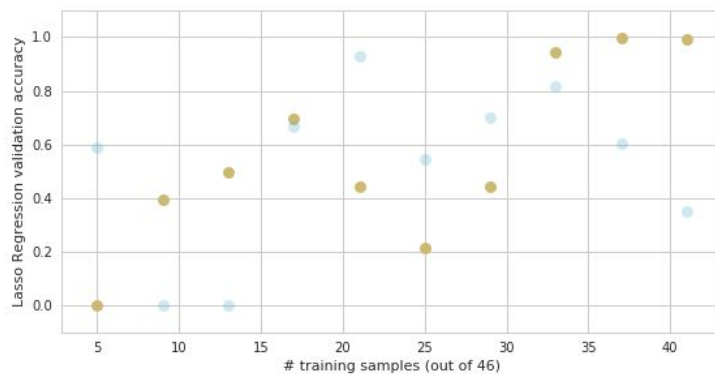
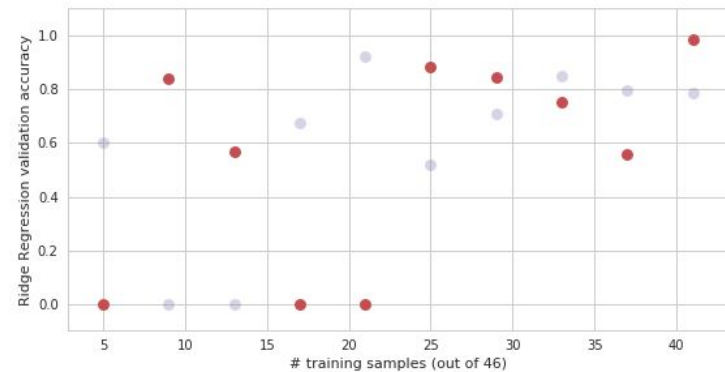
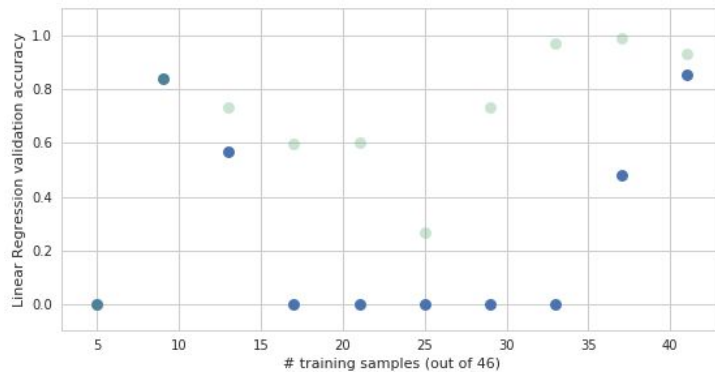


**Below:** Linear regression performance (validation accuracy, up to 1.0) over multiple cross-validation splits, with models trained on polynomial (all polynomial combinations of) features, up to degree= $|\text{features}|$

Features = [Time, Load, Cycle #, Heating, Cooling, Tail, Belly ]

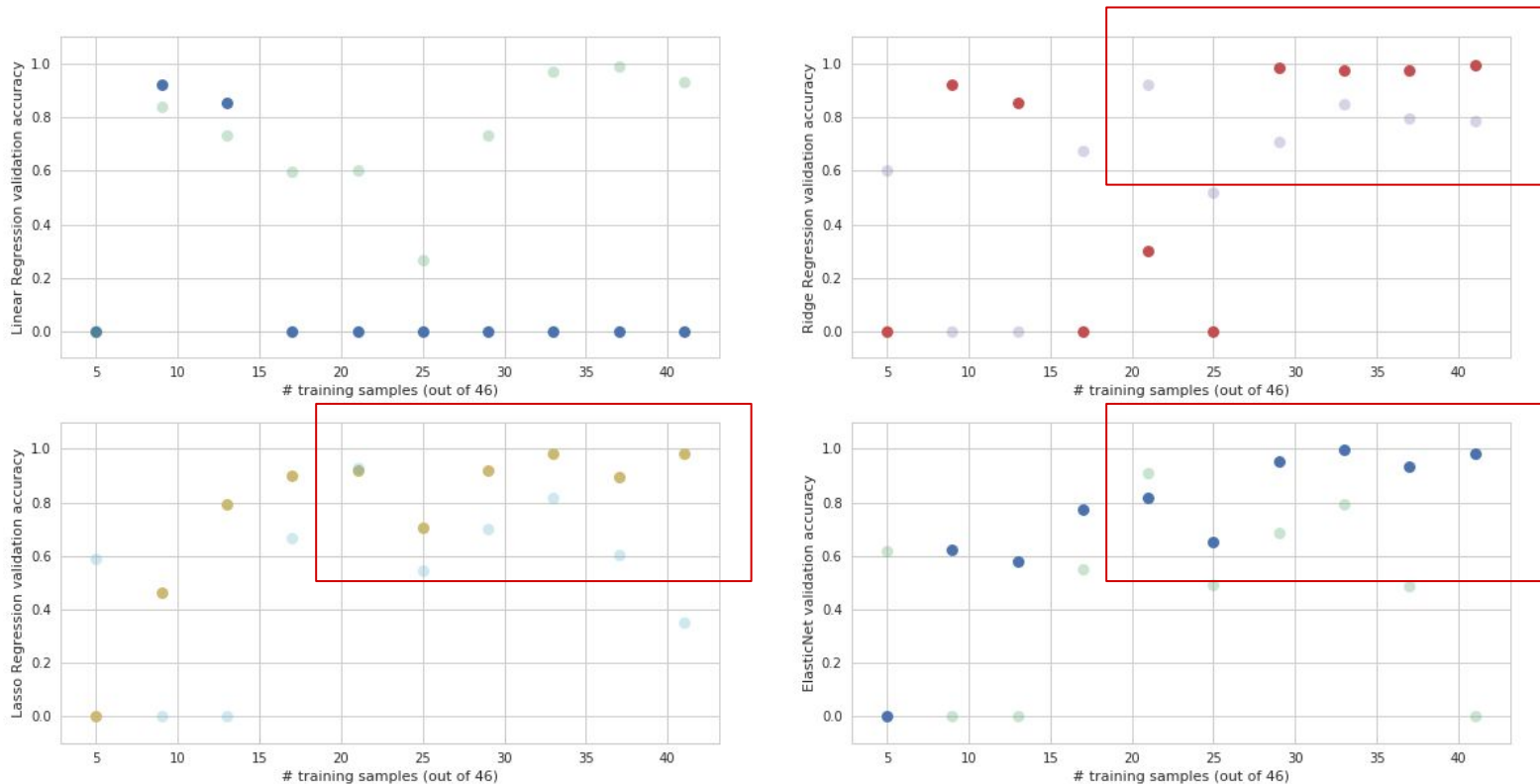
Linear regression performance on Area prediction, with polynomial features  
(Performance on original features in faded colors)



**Below:** Linear regression performance (validation accuracy, up to 1.0) over multiple cross-validation splits, with models trained on polynomial features **including skew and kurtosis**.

Validation error of models with a regularization term (e.g. all methods except standard linear regression) noticeably decreases (validation accuracy increases).

Linear regression performance on Area prediction, with polynomial features  
(Performance on original features in faded colors)



**Question:** What features are most heavily impacting model performance? (i.e. which features are most strongly weighted by each regression method?)

**Answer:** Load, Heating time, Kurtosis

Then (less strongly) Cycle #, Cooling time, Skew, Tail (time <10% max load)

```
In [165]: for clf in clfs:
           rfe = RFE(clf, n_features_to_select=5)
           rfe.fit(X_train, y_train) # use the most recent training datasets
           print(rfe.ranking_, rfe.support_)
           print(X_train.columns[rfe.support_])

[3 1 2 1 1 4 1 1] [False  True False  True  True False  True  True]
Index(['Load', 'Heating', 'Cooling', 'Skew', 'Kurt'], dtype='object')
[4 1 1 1 2 3 1 1] [False  True  True  True False False  True  True]
Index(['Load', 'Cycle', 'Heating', 'Skew', 'Kurt'], dtype='object')
[3 1 1 1 1 2 4 1] [False  True  True  True  True False False  True]
Index(['Load', 'Cycle', 'Heating', 'Cooling', 'Kurt'], dtype='object')
[4 1 1 1 1 2 3 1] [False  True  True  True  True False False  True]
Index(['Load', 'Cycle', 'Heating', 'Cooling', 'Kurt'], dtype='object')
```

**Time-series analysis using fbprophet library:** Observed (ground truth) Load in black; predicted/trend values in blue. fbprophet is a time-series analysis/forecasting library designed to work with seasonal/periodic data.

Unfortunately, a common issue encountered so far in both LSTM and autoregressive approaches is non-periodic cycles, so fbprophet fails on the parameters attempted so far.

