## STREAMLINE Training Summary Report: 2023-06-29 20:30:03.430799

## **General Pipeline Settings:**

Data Path:

 $/Users/y anbo/Dropbox/STREAMLINE-Regression\_AMIA/Measurements/A$ 

DAS11

Output Path:

/Users/yanbo/Dropbox/STREAMLINE-Regression\_AMIA/Colab\_Output

Experiment Name: Demo\_Experiment Class Label: Cognition\_Score

Instance Label: Class
Ignored Features: None

Specified Categorical Features: None

CV Partitions: 5 Partition Method: R Match Label: None Categorical Cutoff: 10

Statistical Significance Cutoff: 0.05 Export Feature Correlations: True Export Univariate Plots: False

Random Seed: 42

Run From Jupyter Notebook: False

Use Data Scaling: True
Use Data Imputation: True
Use Multivariate Imputation: True
Use Mutual Information: True
Use MultiSURF: True

Use TURF: False
TURF Cutoff: 0.5
MultiSURF Instance Subset: 2000
May Features to Keep: 2000

Max Features to Keep: 2000
Filter Poor Features: False
Top Features to Display: 40
Export Feature Importance Plot: 7

Export Feature Importance Plot: True Overwrite CV Datasets: True

Primary Metric: explained\_variance

Uniform Feature Importance Estimation (Models): True

Hyperparameter Sweep Number of Trials: 50

Hyperparameter Timeout: 900

Export Hyperparameter Sweep Plots: True

Export Metric Boxplots: True

Export Feature Importance Boxplots: True

Metric Weighting Composite FI Plots: explained\_variance

Top Model Features To Display: 40

## ML Modeling Algorithms:

Linear Regression: True Elastic Net: True Group Lasso: False RF Regressor: False AdaBoost: False GradBoost: False SVR: True L21Reg: True L21GMMReg: False L21DGMMReg: False

## Datasets:

D1 = av45\_ADAS11 D2 = fdg\_ADAS11 D3 = vbm\_ADAS11

## **Univariate Analysis of Each Dataset (Top 10 Features for Each)**

## $D1 = av45\_ADAS11$

#### Feature: P-Value

Cuneus\_R: 0.019047619047619

Heschl\_R: 0.1142857142857143

Amygdala\_L: 0.1714285714285714

Amygdala\_R: 0.1714285714285714

Occipital\_Inf\_L: 0.1714285714285714

Angular\_R: 0.1714285714285714

Paracentral\_Lobule\_R: 0.1714285714285714

Caudate\_L: 0.1714285714285714 Heschl\_L: 0.1714285714285714 Temporal\_Sup\_L: 0.1714285714285714

## $D2 = fdg\_ADAS11$

## Feature: P-Value

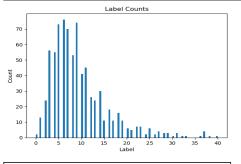
Occipital\_Inf\_L: 0.0761904761904762
Fusiform\_L: 0.0761904761904762
Occipital\_Mid\_L: 0.1142857142857143
Cuneus\_L: 0.1714285714285714
Cuneus\_R: 0.1714285714285714
Temporal\_Mid\_R: 0.1714285714285714
Vermis\_1\_2: 0.1714285714285714
Vermis\_10: 0.1714285714285714
Occipital\_Sup\_L: 0.2285714285714285
Heschl\_L: 0.2285714285714285

## $D3 = vbm\_ADAS11$

#### Feature: P-Value

SupraMarginal\_R: 0.0380952380952381
Frontal\_Inf\_Oper\_L: 0.0761904761904762
Angular\_R: 0.0761904761904762
Putamen\_L: 0.0761904761904762
Heschl\_R: 0.0761904761904762
Temporal\_Sup\_R: 0.0761904761904762
Temporal\_Mid\_R: 0.0761904761904762
Cerebelum\_7b\_R: 0.0761904761904762
Frontal\_Inf\_Tri\_L: 0.1142857142857143
Frontal\_Inf\_Orb\_R: 0.1142857142857143

## Dataset and Model Prediction Summary: D1 = av45\_ADAS11



## **Dataset Counts Summary:**

instances: 787.0 features: 116.0

categorical\_features: 0.0 quantitative\_features: 116.0 missing\_values: 0.0 missing\_percent: 0.0

## Top ML Algorithm Results (Averaged Over CV Runs):

Best (Max Error): Linear Regression = 21.428

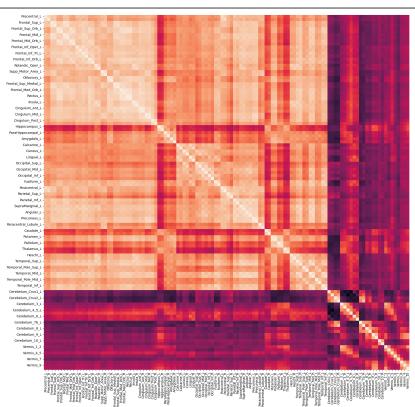
Best (Mean Absolute Error): SVR = 3.948

Best (Mean Squared Error): Elastic Net = 29.396

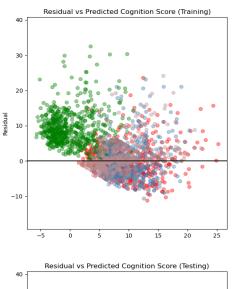
Best (Explained Variance): Elastic Net = 0.288

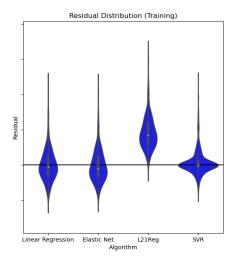
Best (Median Absolute Error): SVR = 2.937

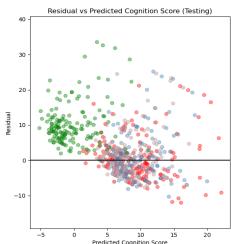
Best (Pearson Correlation): Linear Regression = 0.491

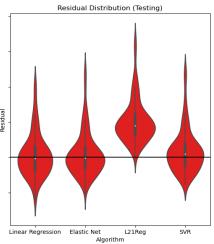




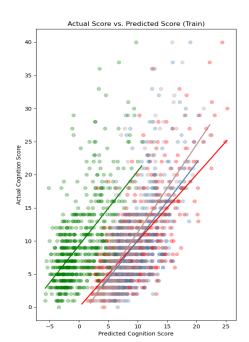


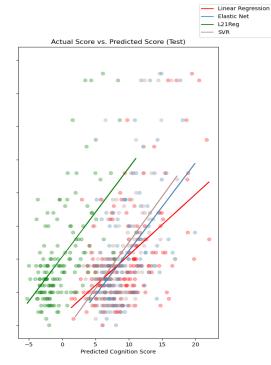


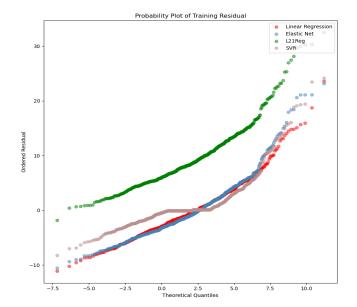


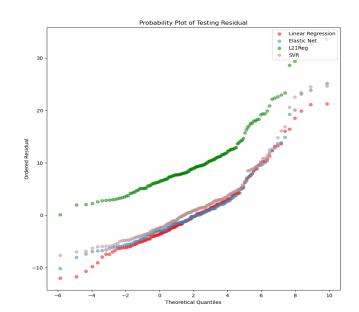


# Dataset and Model Prediction Summary: D1 = av45\_ADAS11

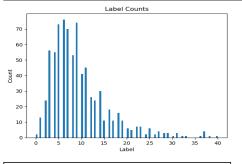








## Dataset and Model Prediction Summary: D2 = fdg\_ADAS11



## **Dataset Counts Summary:**

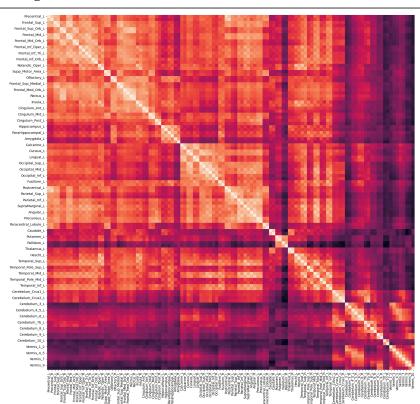
instances: 787.0 features: 116.0

categorical\_features: 0.0 quantitative\_features: 116.0 missing\_values: 0.0 missing\_percent: 0.0

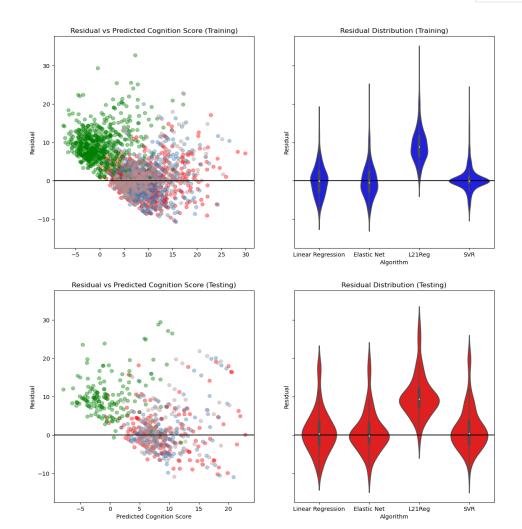
## Top ML Algorithm Results (Averaged Over CV Runs):

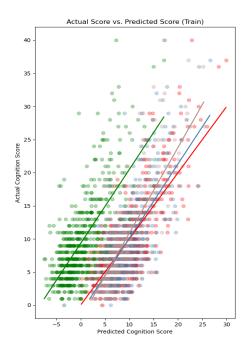
Best (Max Error): Linear Regression = 17.290 Best (Mean Absolute Error): Elastic Net = 3.692 Best (Mean Squared Error): Elastic Net = 24.608 Best (Explained Variance): L21Reg = 0.402 Best (Median Absolute Error): SVR = 2.786

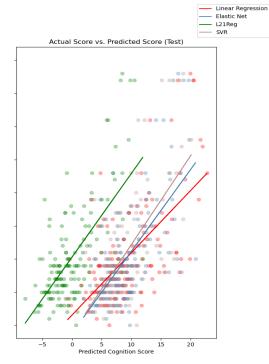
Best (Pearson Correlation): SVR = 0.617

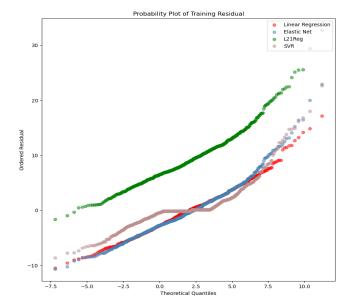


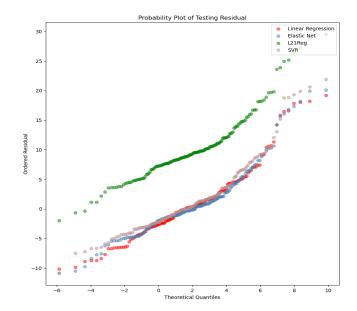




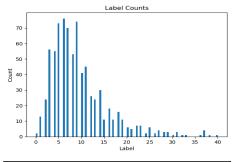








## Dataset and Model Prediction Summary: D3 = vbm\_ADAS11



## **Dataset Counts Summary:**

instances: 787.0 features: 116.0

categorical\_features: 0.0 quantitative\_features: 116.0 missing\_values: 0.0 missing\_percent: 0.0

## Top ML Algorithm Results (Averaged Over CV Runs):

Best (Max Error): Elastic Net = 19.847

Best (Mean Absolute Error): Elastic Net = 3.968

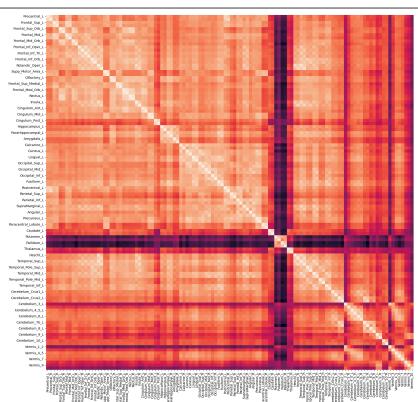
Best (Mean Squared Error): Elastic Net = 28.463

Best (Explained Variance): Elastic Net = 0.306

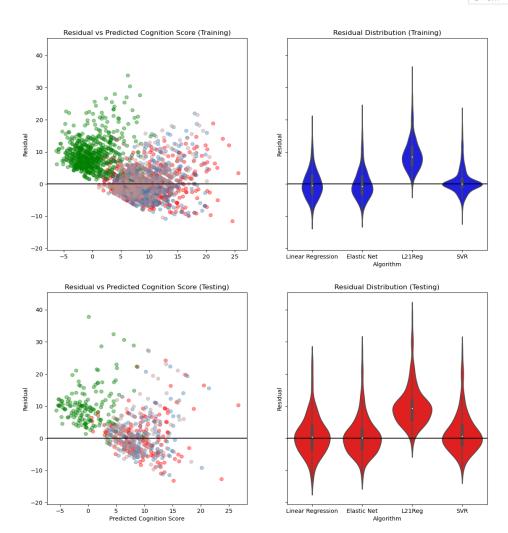
Best (Median Absolute Error): SVR = 3.156

Best (Median Absolute Error). 5 v K = 5.150

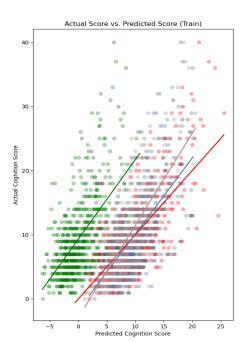
Best (Pearson Correlation): Linear Regression = 0.526

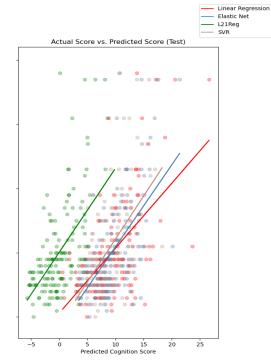


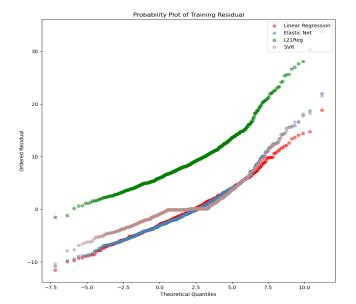


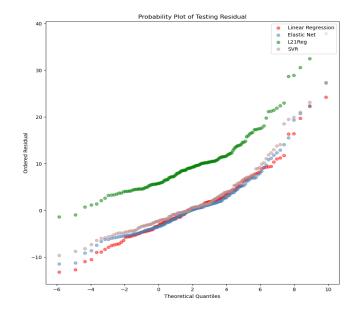


# Dataset and Model Prediction Summary: D3 = vbm\_ADAS11









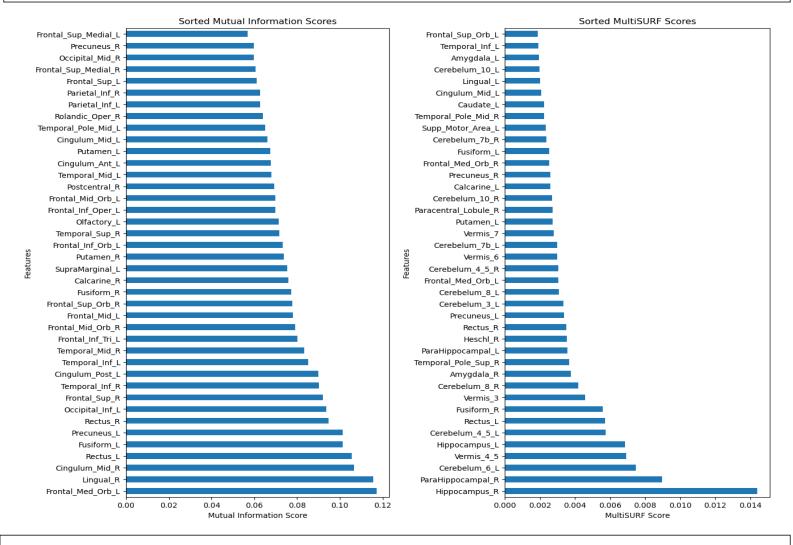
# **Average Model Prediction Statistics (Rounded to 3 Decimal Points)**

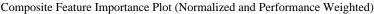
D1 = av45_ADAS11							
ML Algorithm	Max Error	Mean Absolute	Mean Squared	Median Absolute	Explained Variance	Pearson Correlation	
Linear Regression	21.428	4.357	33.374	3.505	0.174	0.491	
Elastic Net	22.199	4.001	29.396	3.17	0.288	0.544	
L21Reg	31.475	9.496	118.951	8.667	0.287	0.544	
SVR	23.214	3 948	30.365	2.937	0.279	0.536	

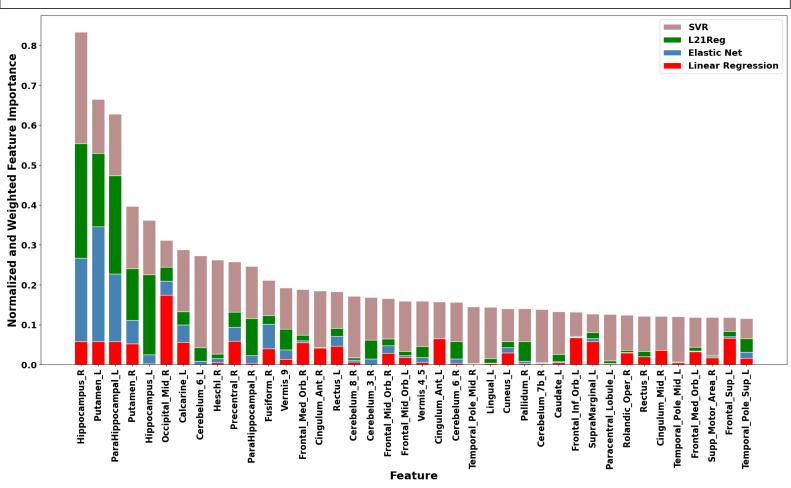
$D2 = fdg\_ADAS11$						
ML Algorithm	Max Error	Mean Absolute	Mean Squared	Median Absolute	Explained Variance	Pearson Correlation
Linear Regression	17.29	3.966	26.616	3.268	0.346	0.625
Elastic Net	18.646	3.692	24.608	2.796	0.401	0.644
L21Reg	28.378	9.488	113.793	9.006	0.402	0.644
SVR	18.647	3.737	26.304	2.786	0.363	0.617

L21Reg	28.378	9.488	113.793	9.006	0.402	0.644
SVR	18.647	3.737	26.304	2.786	0.363	0.617
$D3 = vbm\_ADAS11$						
ML Algorithm	Max	Mean	Mean	Median	Explained	Pearson
	Error	Absolute	Squared	Absolute	Variance	Correlation
Linear Regression	20.356	4.249	31.294	3.302	0.218	0.526
Elastic Net	19.847	3.968	28.463	3.227	0.306	0.562
L21Reg	30.471	9.488	118.762	8.734	0.29	0.544
SVR	21.329	4.025	30.581	3.156	0.272	0.539
			•	•	•	

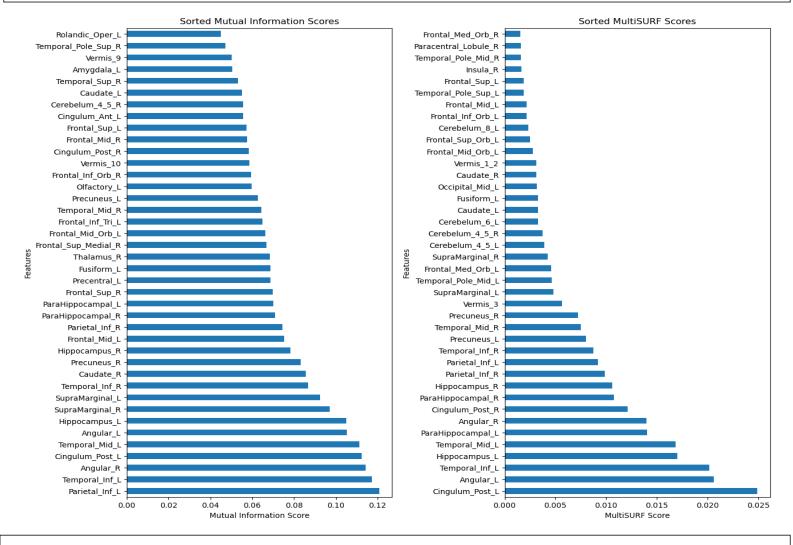
## **Feature Importance Summary: D1 = av45\_ADAS11**

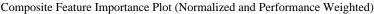


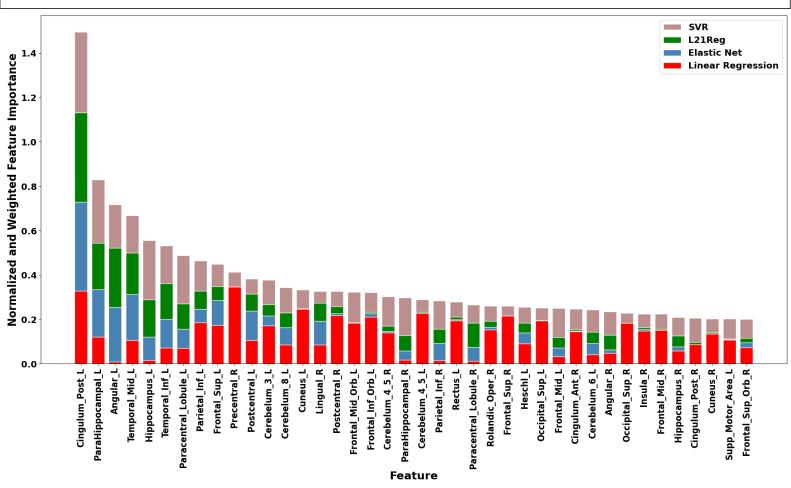




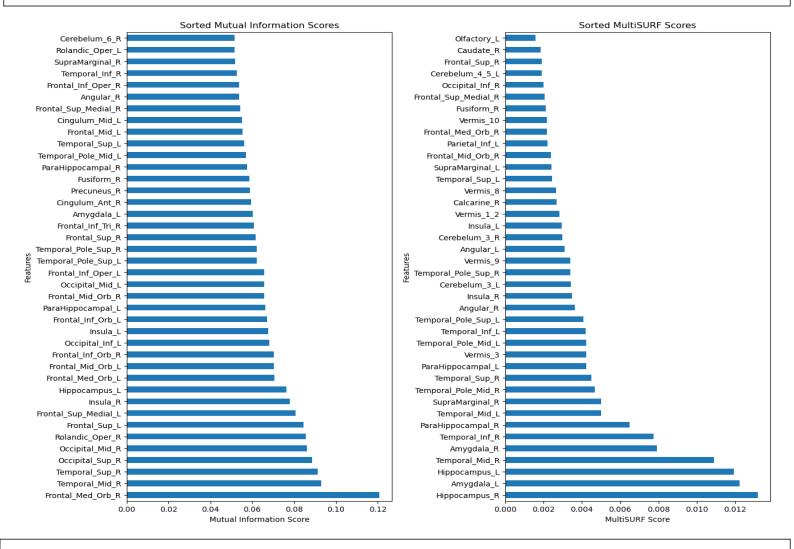
## Feature Importance Summary: D2 = fdg\_ADAS11



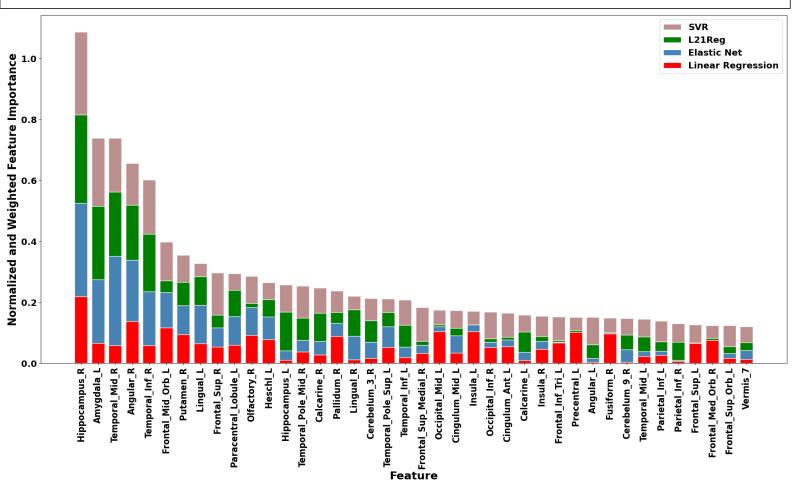




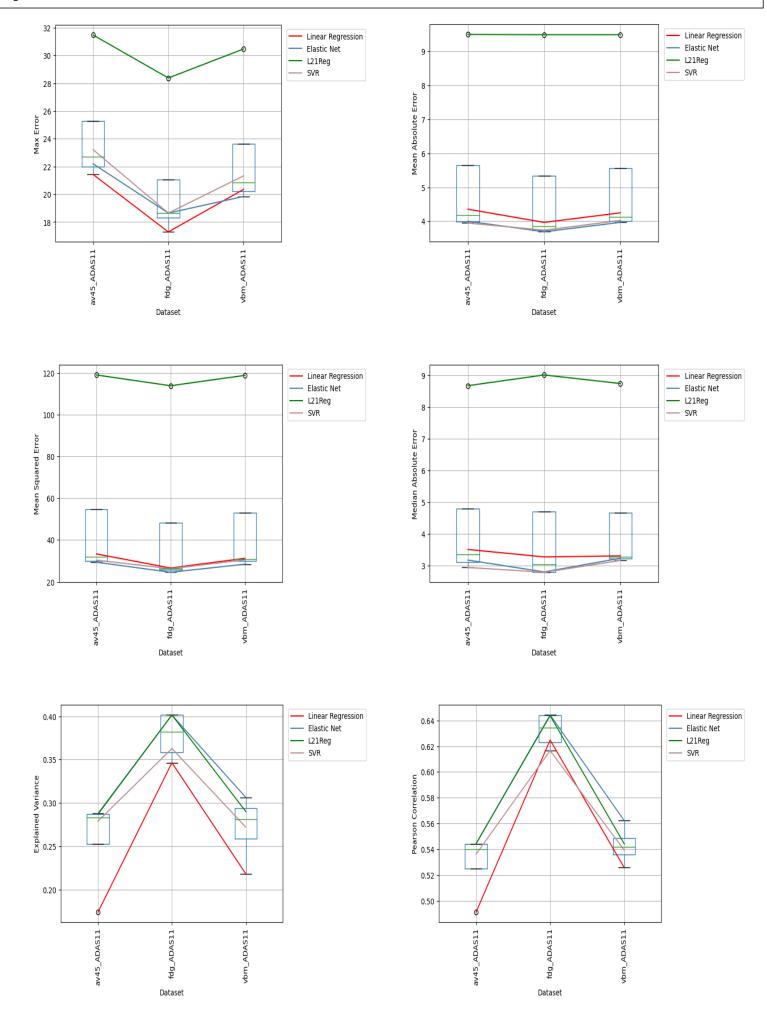
## Feature Importance Summary: D3 = vbm\_ADAS11



Composite Feature Importance Plot (Normalized and Performance Weighted)



## **Compare ML Performance Across Datasets**



# Using Best Performing Algorithms (Kruskall Wallis Compare Datasets)

Datasets:

D1 = av45\_ADAS11

D2 = fdg\_ADAS11

D3 = vbm\_ADAS11

index	P-Value	Best_Alg_D1	Mean_D1	Best_Alg_D2		Best_Alg_D3	Mean_D3
Max Error	0.4819	L21Reg	31.4748	L21Reg	28.3776	L21Reg	30.4709
Mean Absolute Error	1.0	L21Reg	9.4957	L21Reg	9.4875	L21Reg	9.4879
Mean Squared Error	0.8781	L21Reg	118.9512	L21Reg	113.7927	L21Reg	118.7621
Median Absolute Erro	r0.6907	L21Reg	8.6667	L21Reg	9.0057	L21Reg	8.734
	0.075	Elastic Net	0.288	L21Reg	0.4015	Elastic Net	0.3064
Pearson Correlation	0.0226	Elastic Net	0.5443	Elastic Net	0.6443	Elastic Net	0.5623

## **Pipeline Runtime Summary**

av45_ADAS11		fdg_ADAS11	[fdg_ADAS11		
Pipeline Component	Time (sec)	Pipeline Component	Time (sec)		
Exploratory Analysis	1.66	Exploratory Analysis	1.49		
Preprocessing	0.08	Preprocessing	0.07		
Mutual Information	24.11	Mutual Information	24.29		
MultiSURF	104.99	MultiSURF	103.99		
Feature Selection	0.52	Feature Selection	0.4		
Linear Regression	2.69	Linear Regression	43.47		
Elastic Net	29.88	Elastic Net	87.87		
L21Reg	359.44	L21Reg	359.44		
SVR	714.36	SVR	879.44		
Stats Summary	108.74	Stats Summary	19.47		

vbm_ADAS11					
Pipeline Component	Time (sec)				
Exploratory Analysis	1.44				
Preprocessing	0.07				
Mutual Information	23.92				
MultiSURF	107.56				
Feature Selection	0.39				
Linear Regression	46.2				
Elastic Net	119.61				
L21Reg	359.44				
SVR	771.17	•			
Stats Summary	393.39				