

# CSML1010 – Milestone 2

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# Twitter US Airline – Sentiment Analysis

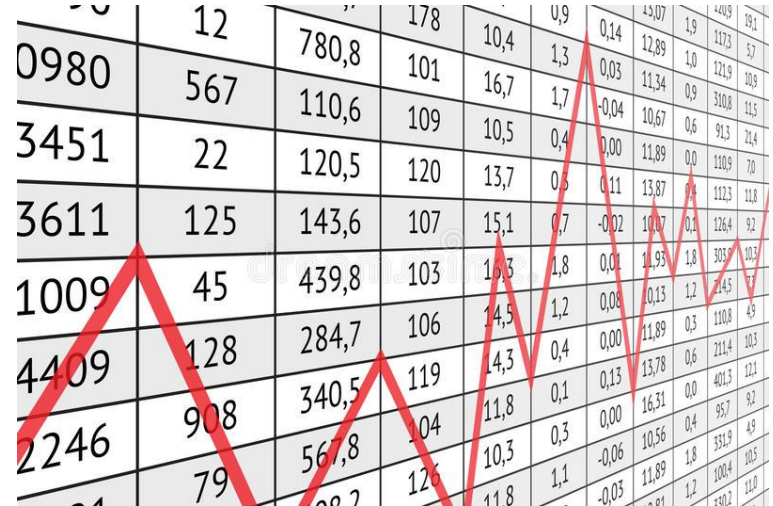
## – Milestone 2

- Model Benchmarking
- Hyperparameter Optimization
- Ensemble Methods
- Analysis and Model Selection



# Twitter US Airline – Sentiment Analysis

- **Combined Feature Engineered Dataset**
  - Data is fully numerical now
- **Engineered Features**
  - E.g. Emojis/Emoticons
  - Hashtags
  - Etc.
- **GloVe Word Embeddings**
  - (300 dimension)
- **Binary response variable**

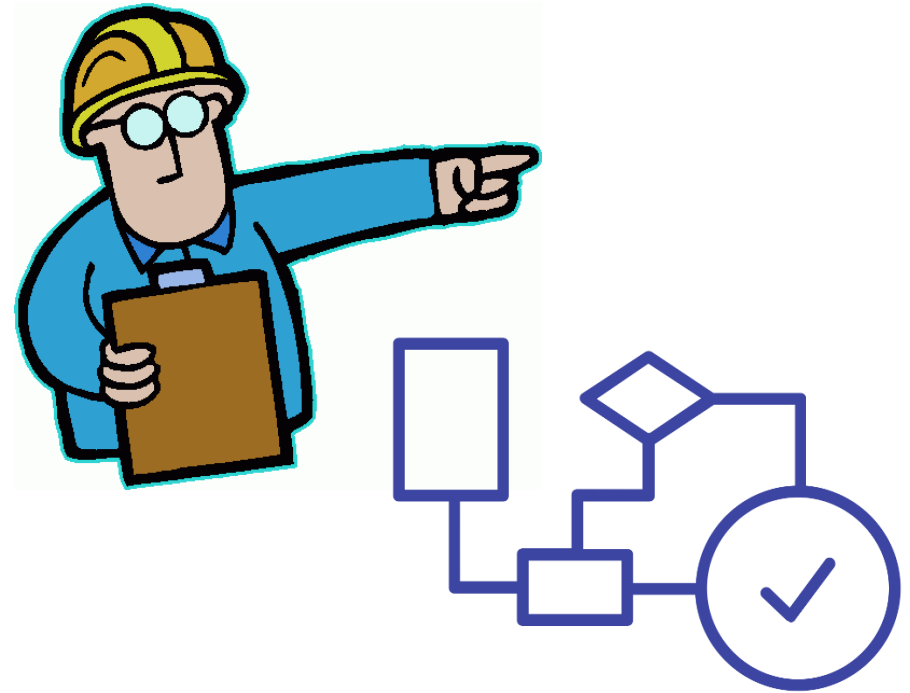


	12	780,8	178	10,4	0,9	0,14	19,07	1,9	4409	19,1
0980	567	110,6	101	16,7	1,3	0,03	12,89	1,0	1173	5,7
3451	22	120,5	109	10,5	0,4	-0,04	10,67	0,9	310,8	11,5
3611	125	143,6	120	13,7	0,5	0,00	11,89	0,0	91,3	21,4
1009	45	439,8	107	15,1	0,7	0,11	13,87	0,1	110,9	7,0
4409	128	284,7	103	14,5	1,8	-0,02	10,07	0,1	112,3	11,8
2246	908	340,5	106	14,3	1,2	0,01	11,95	1,8	303,3	10,3
	79	567,8	119	11,8	0,4	0,08	11,89	1,2	110,8	4,9
			104	10,3	0,1	0,00	13,78	0,6	211,4	10,3
			126	10,3	0,3	0,13	16,31	0,0	401,3	12,1
				11,8	1,1	0,00	10,56	0,4	95,7	9,2
						-0,06	11,89	1,8	351,9	4,9
						-0,05	11,89	1,2	100,4	10,5
									140,2	11,0

# Model Benchmarking – Supervised Learning

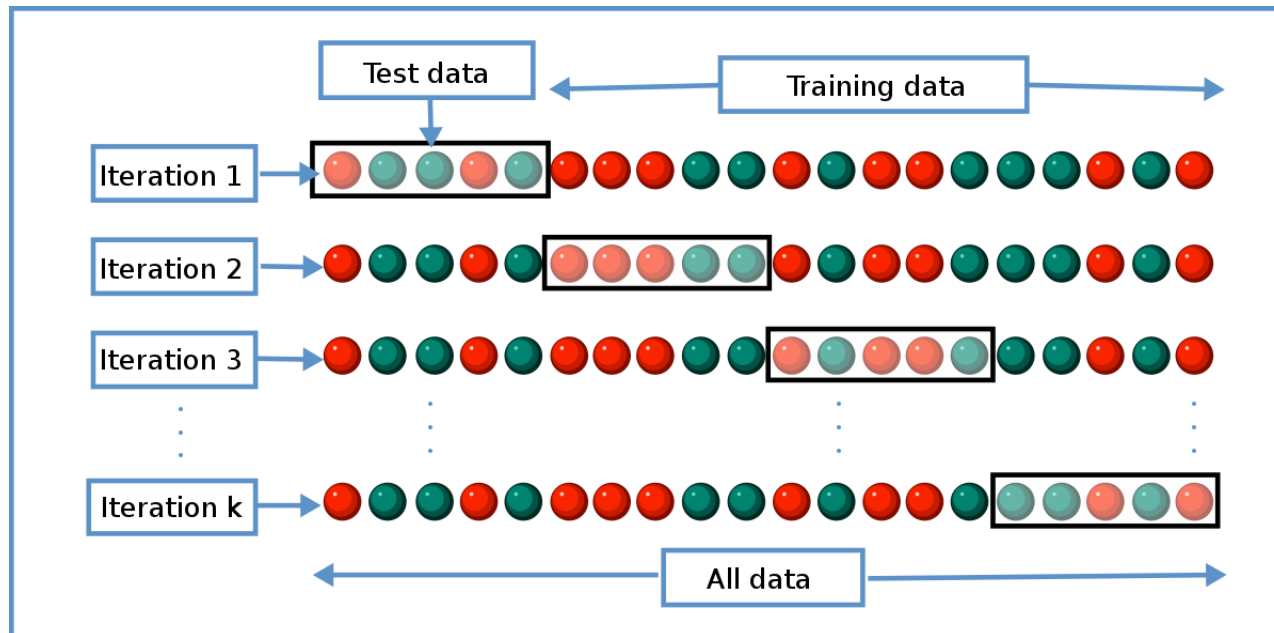
- **Supervised Models (Classification)**

- K Nearest Neighbors
- Decision Tree
- Support Vector Classifier
- Gaussian Naïve Bayes
- Logistic Regression



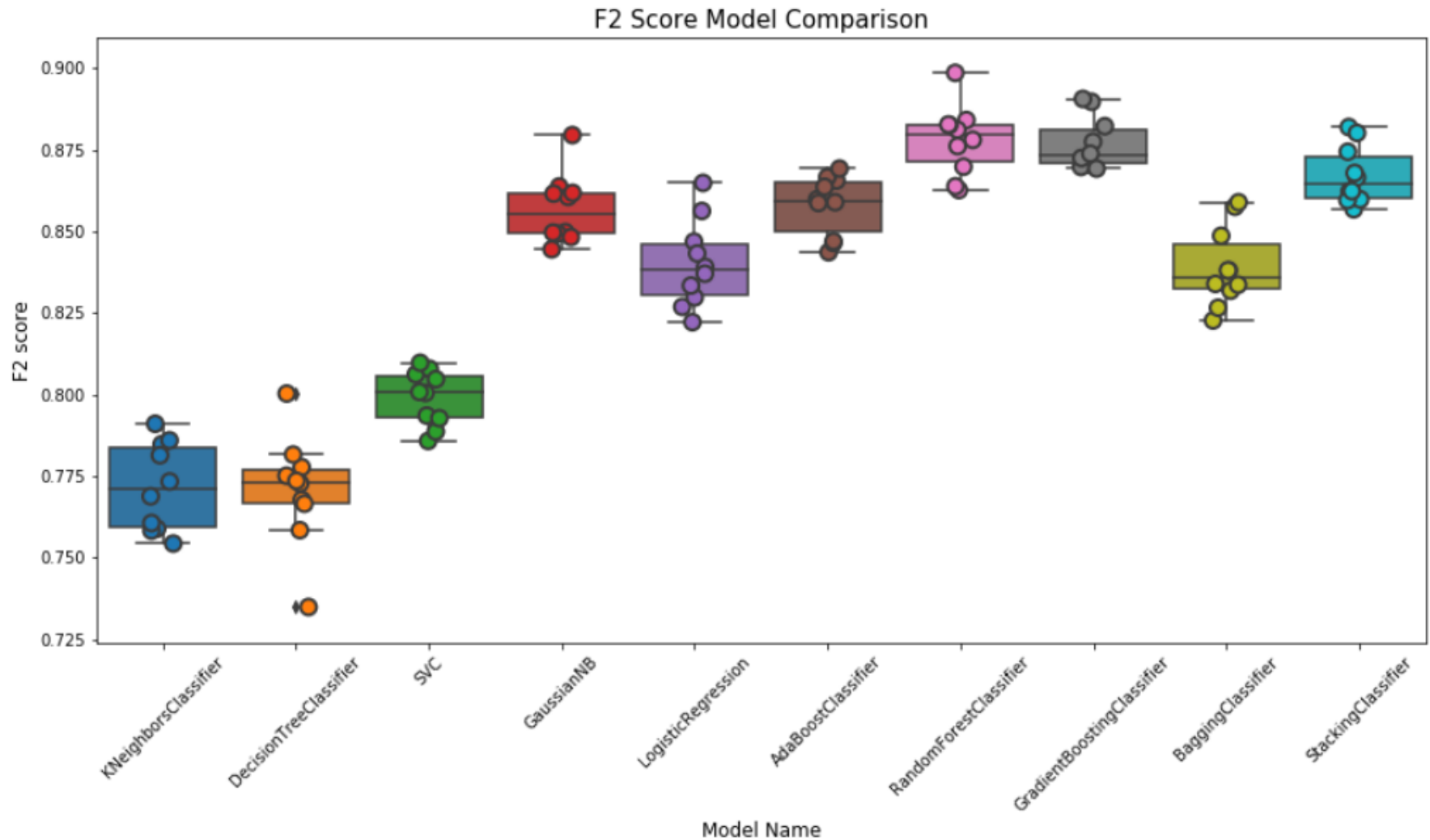
# Model Benchmarking - Execution

- **Stratified K-fold Cross Validation**
  - Using sklearn
  - Various Scorers:
    - Fit time, Score time, Bal. Accuracy, F1 score, F2 score, Precision, Recall, ROC-AUC

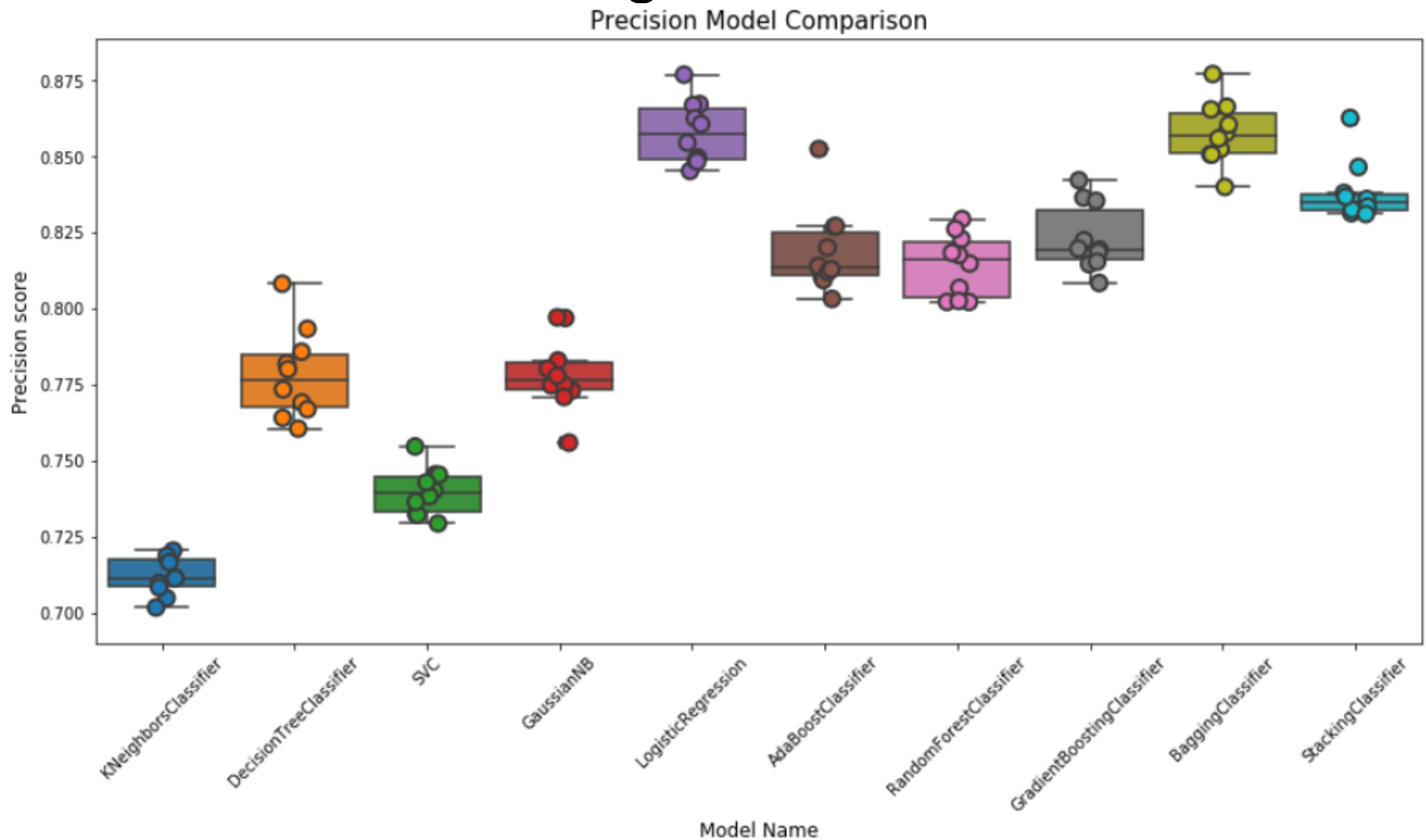




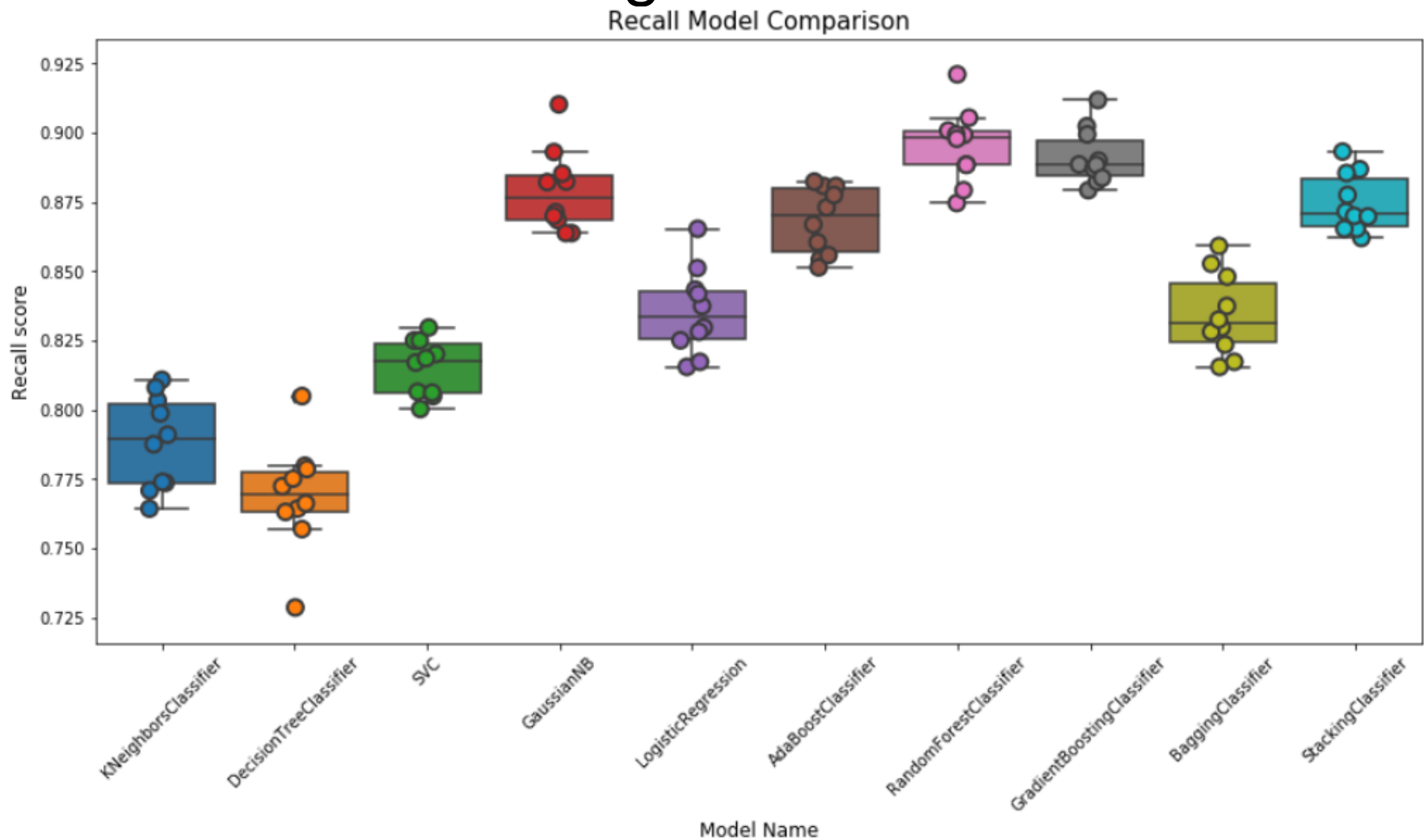
# Model Benchmarking – F2 Score



# Model Benchmarking – Precision

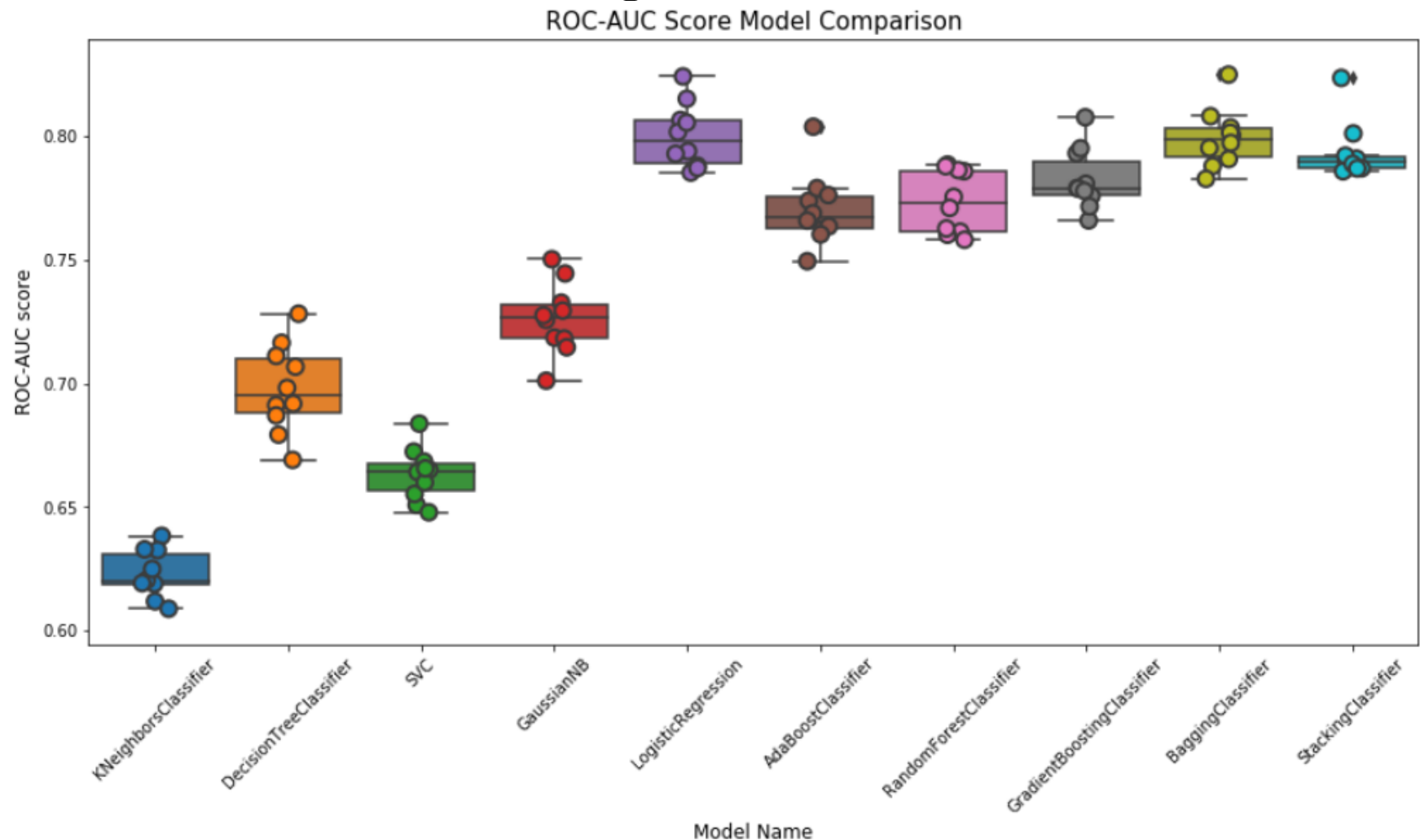


# Model Benchmarking – Recall

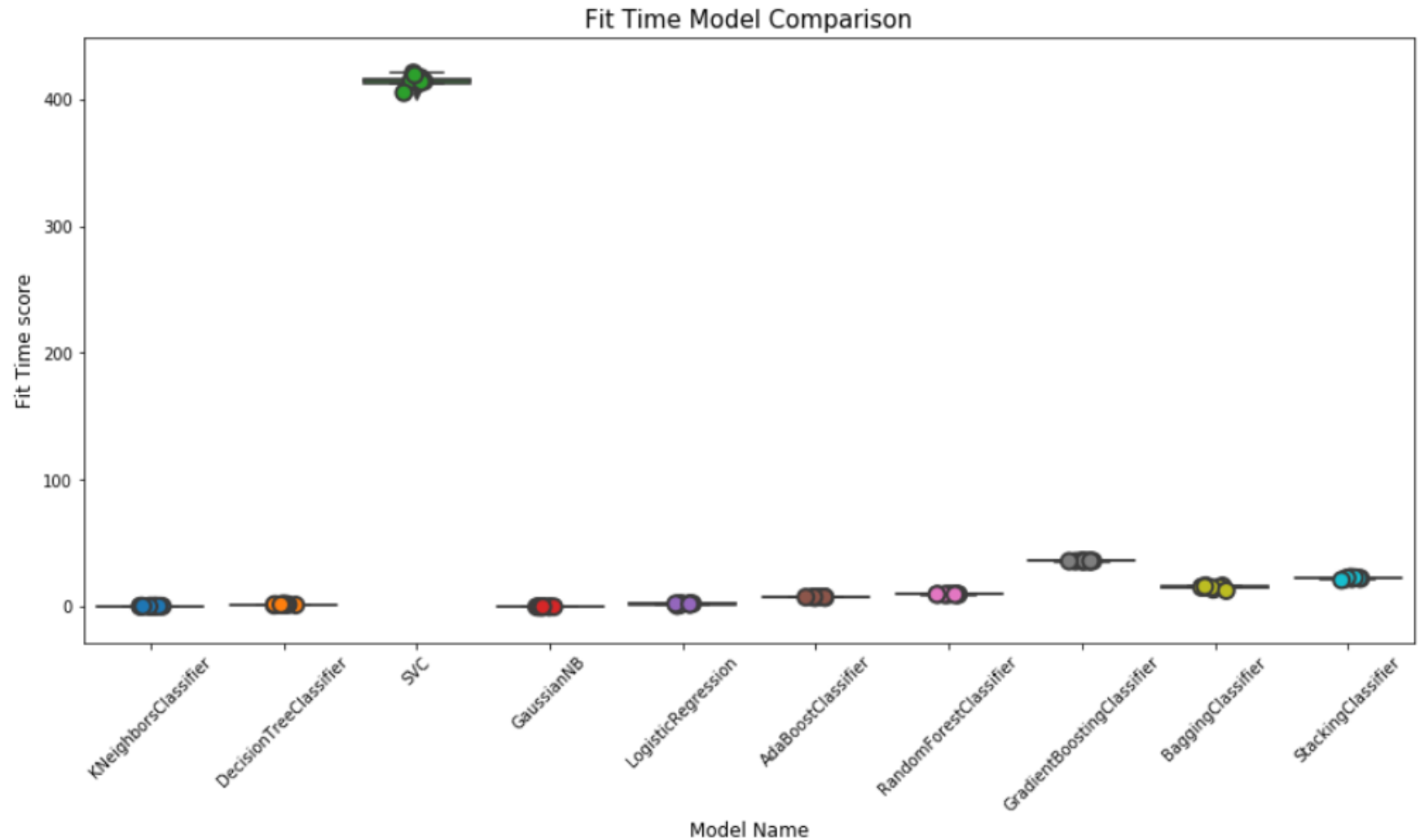




# Model Benchmarking – ROC-AUC



# Model Benchmarking – Fit Time



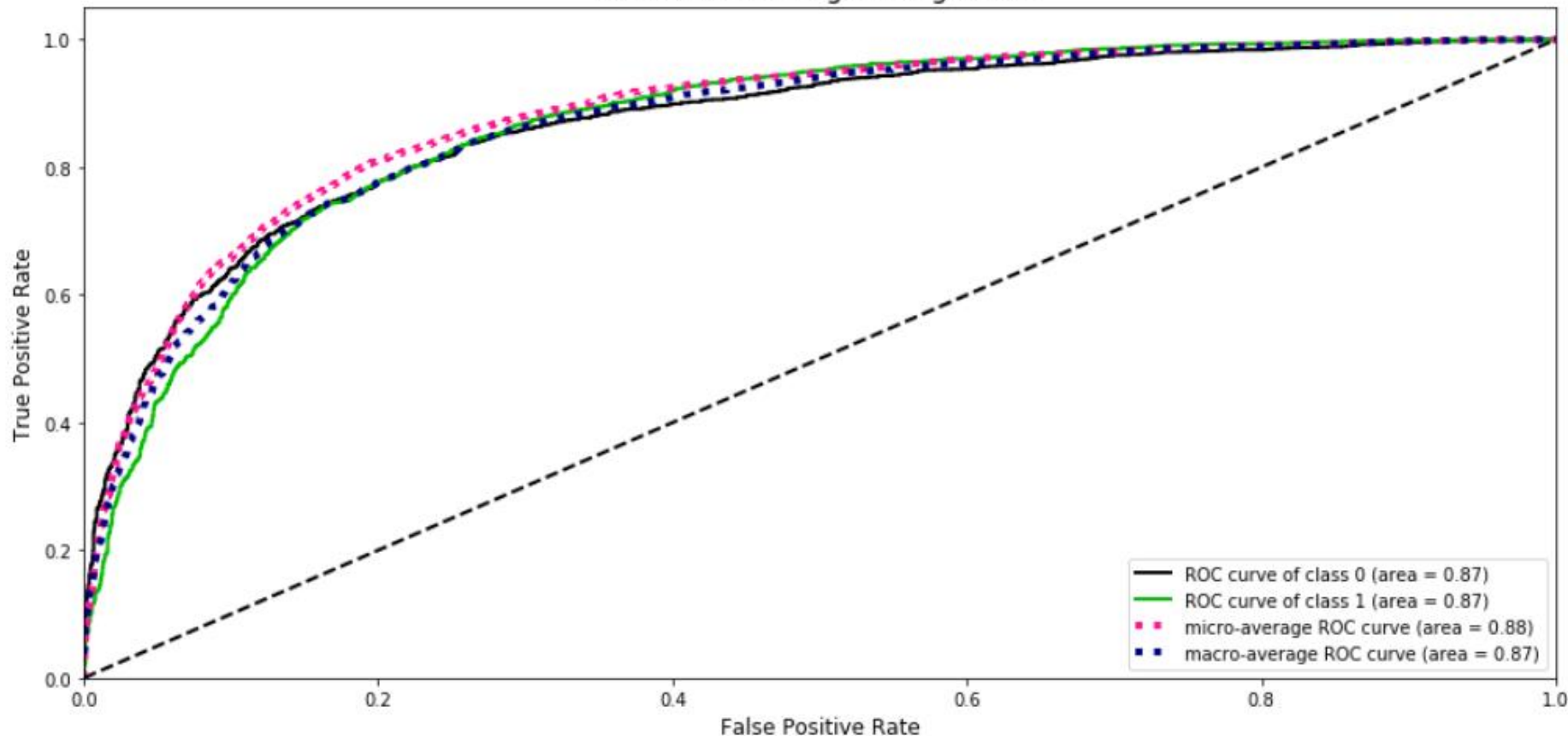
# Hyperparameter Optimization

- **Grid Search**
  - Exhaustive test of parameters from a specified list
  - Time consuming, but certain to provide the best set of parameters
- **Random Search**
  - Random search of provide parameters
  - Faster but could possibly miss some combinations of parameters

# Hyperparameter Optimization

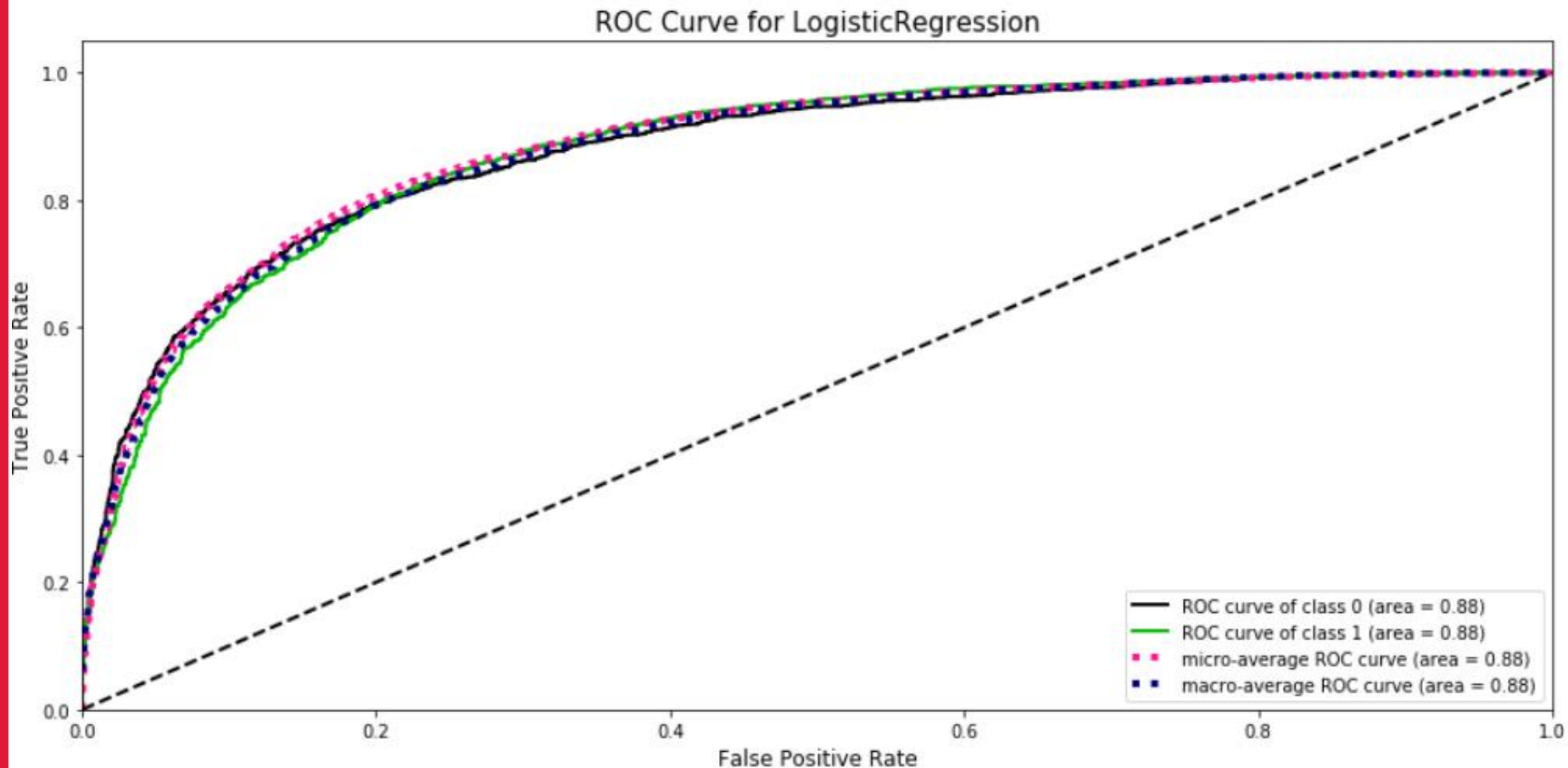
- Logistic Regression – Pre-Optimization*

ROC Curve for LogisticRegression



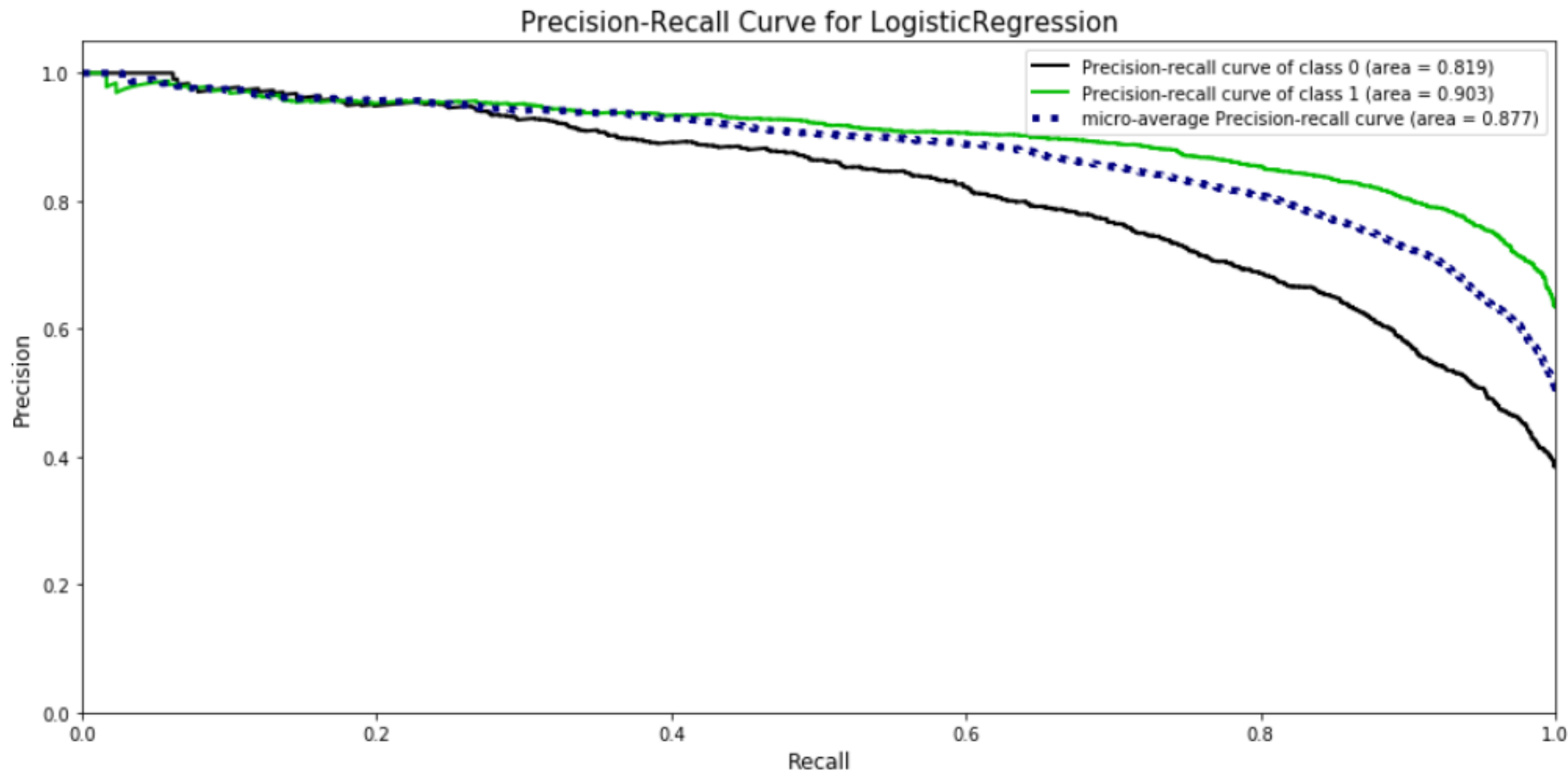
# Hyperparameter Optimization

- *Logistic Regression – Post-Optimization*



# Hyperparameter Optimization

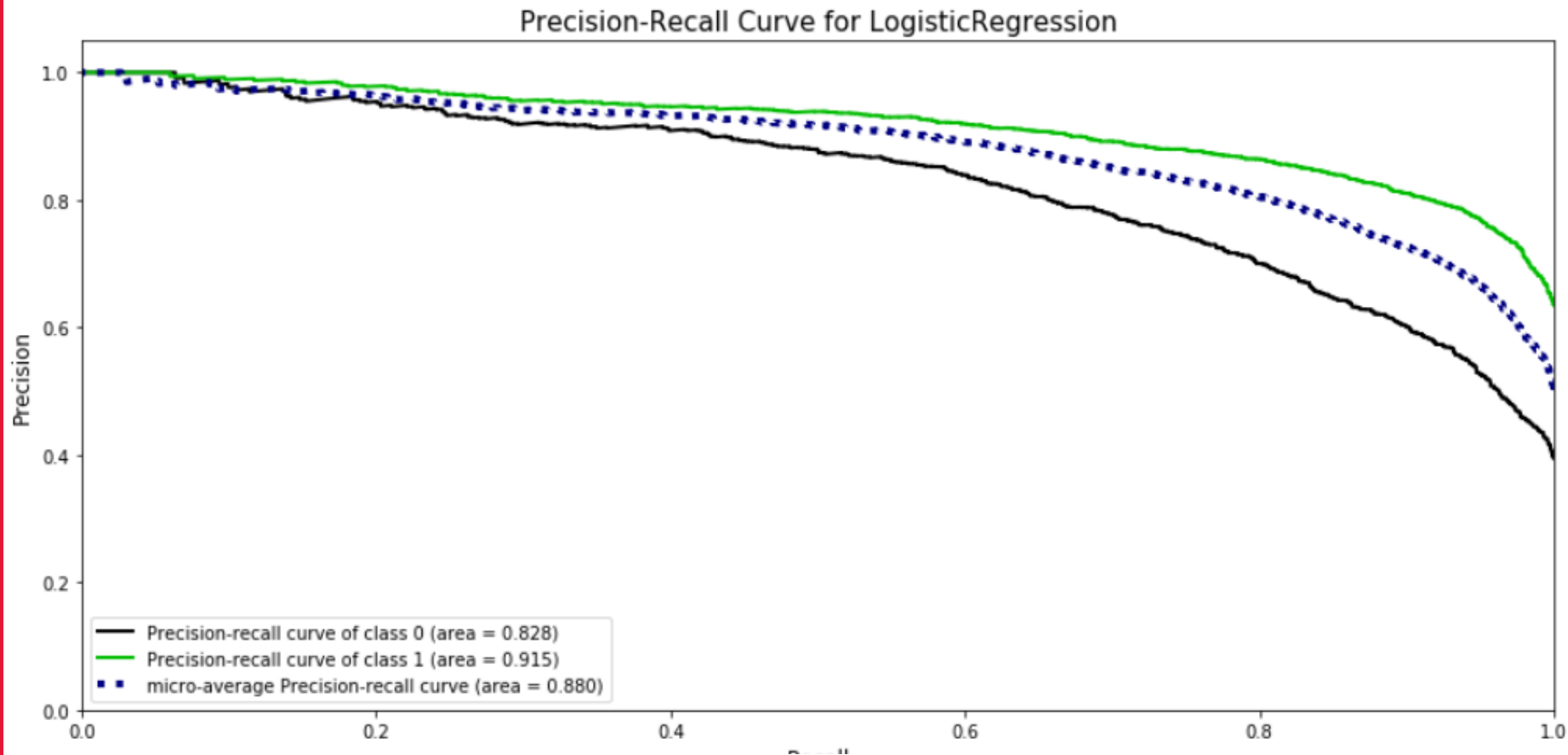
- Logistic Regression – Pre-Optimization*





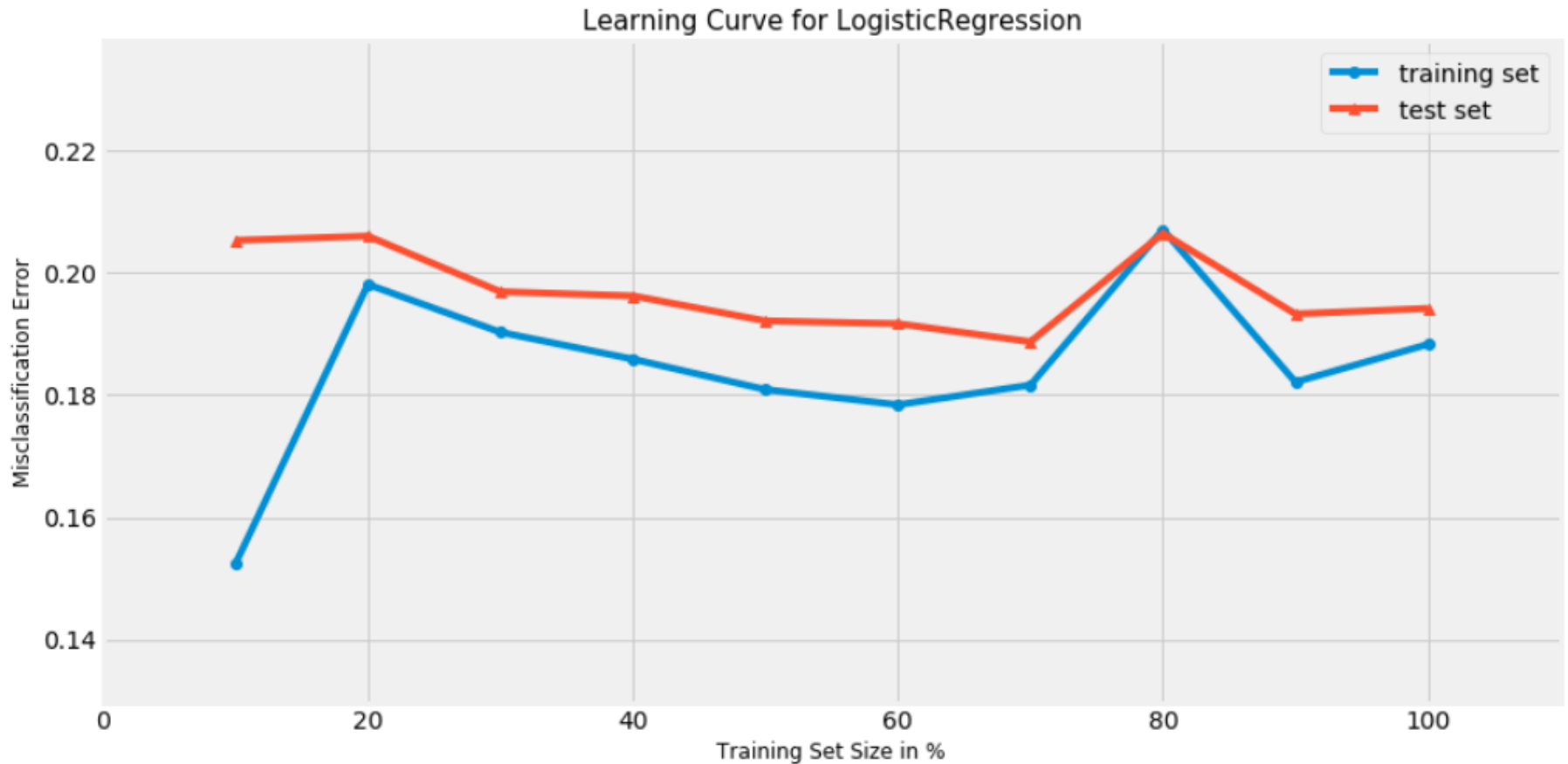
# Hyperparameter Optimization

- *Logistic Regression – Post-Optimization*



# Hyperparameter Optimization

- *Logistic Regression – Pre-Optimization*



# Hyperparameter Optimization

- *Logistic Regression – Post-Optimization*



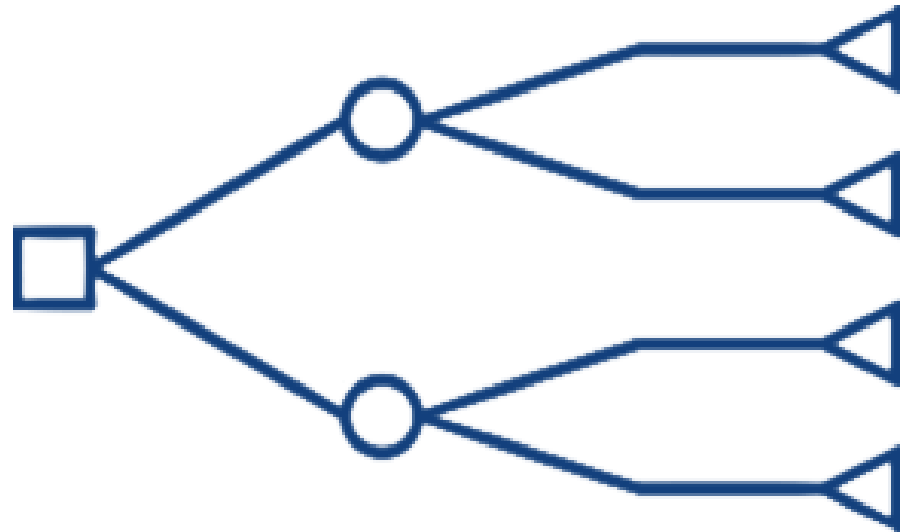
# Ensemble Methods

- **Boosting**

- Gradient Boosting Machine
- Ada Boost

- **Bagging**

- Random Forest
- Bagging Classifier



- **Stacking**

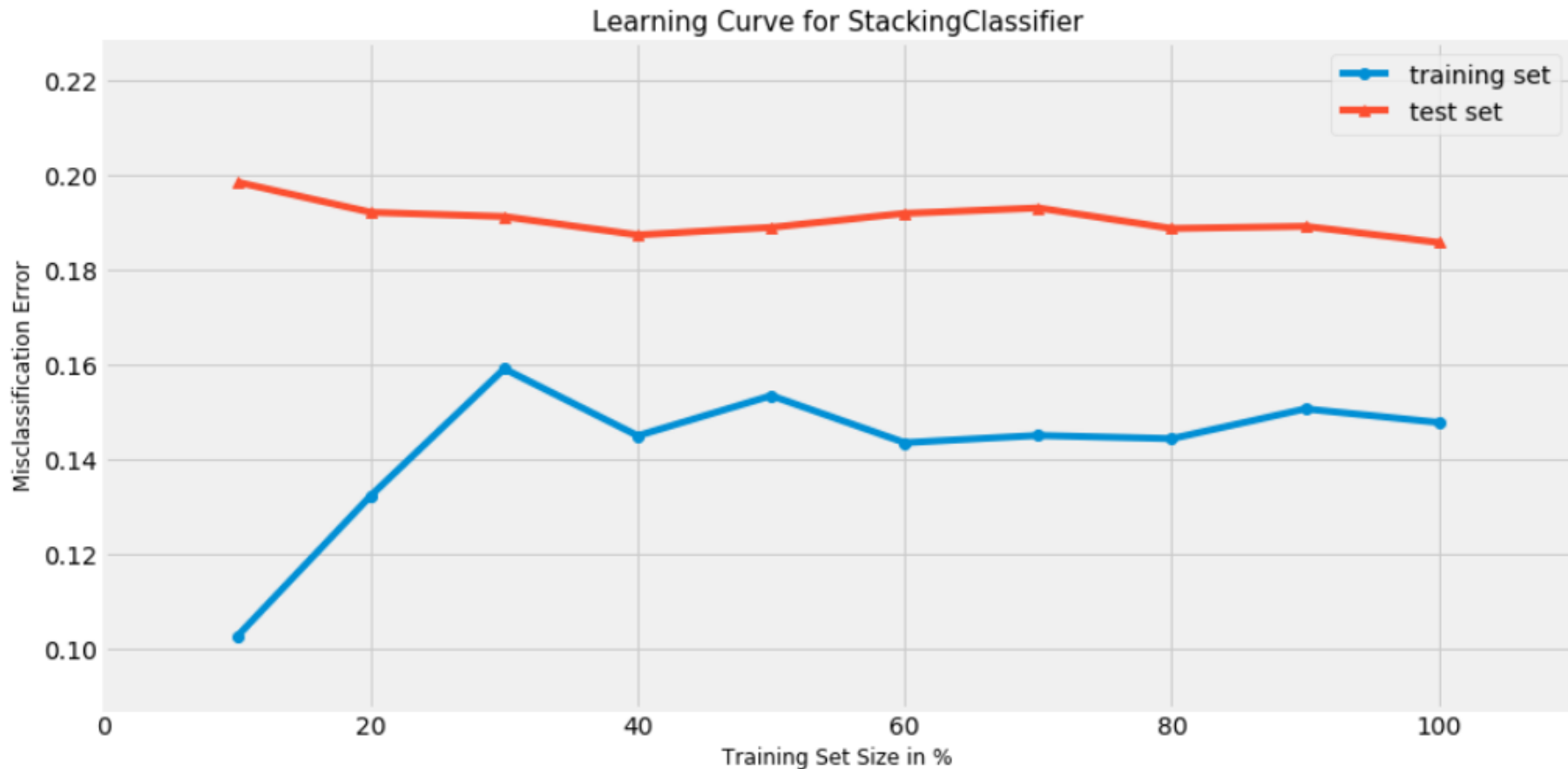
- Stacking Classifier (sci-kit learn 0.22)

# Model Selection

- **Using scores/metrics to select model**
  - F2 score
  - Fit time (as this may need to be deployed)
  - Learning Curve
  - Precision-Recall Curve
- **Narrowed down list**
  - *Logistic Regression*
    - Good fit time, good metrics - selected
  - *Gradient Boosting Machine*
    - Fit time and parameters too complex - rejected
  - *Stacking*
    - Good combination of base learners, fit time acceptable - selected

# Model Selection – Learning Curve

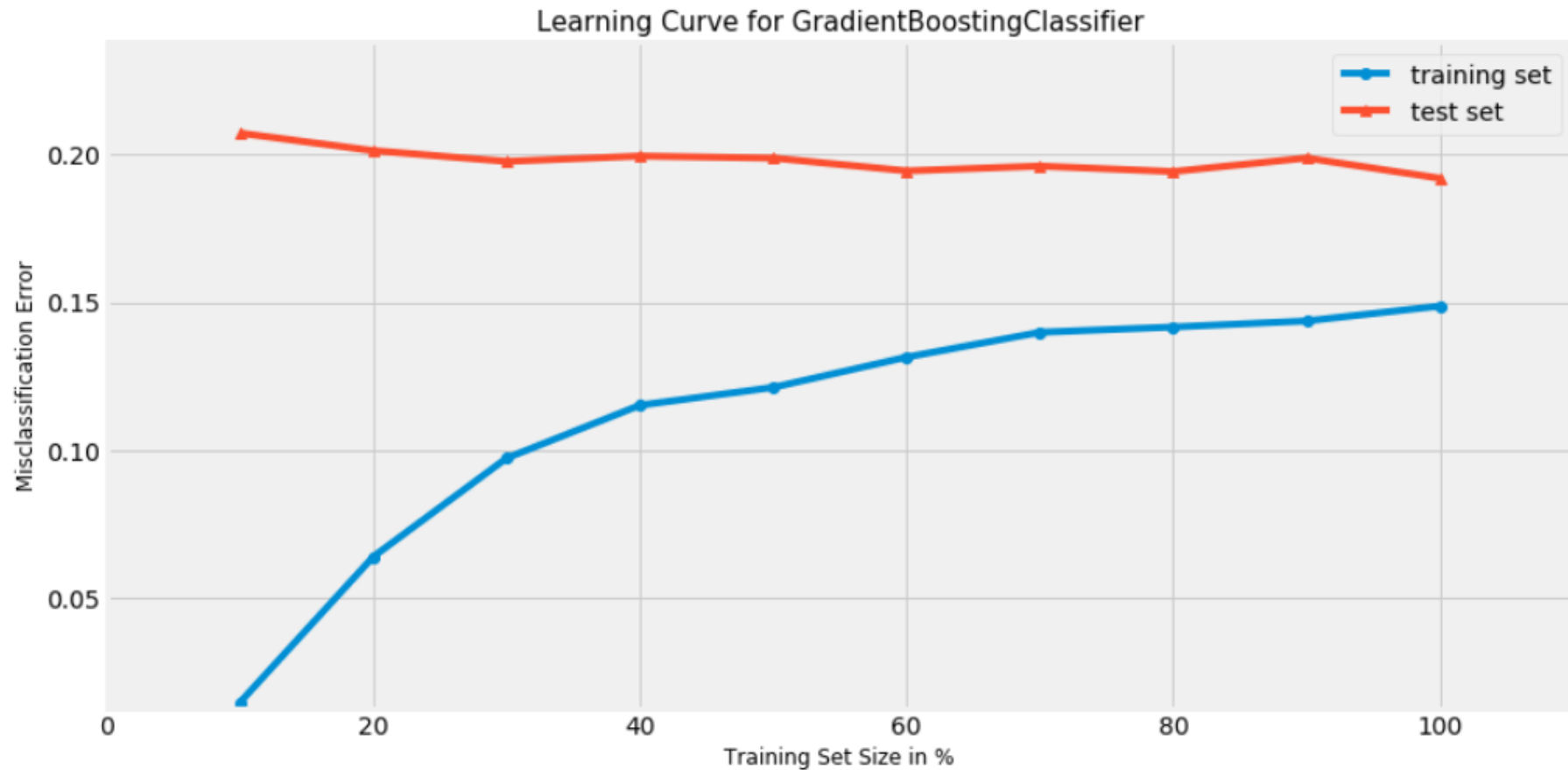
- *Stacking Classifier*





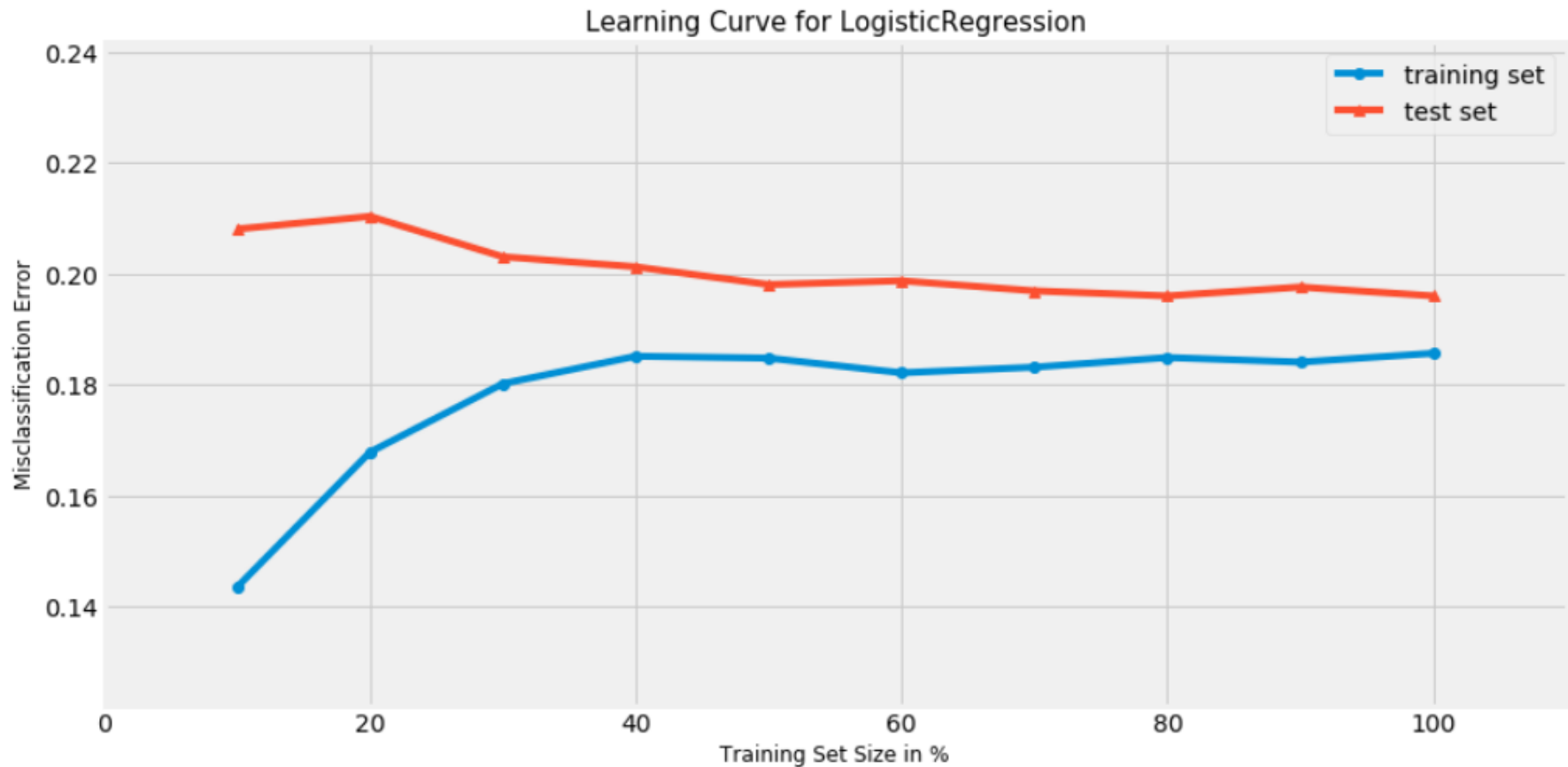
# Model Selection – Learning Curve

- *Gradient Boosting Machine*



# Model Selection – Learning Curve

- *Logistic Regression*





# Thank You!