



Spotify
Billboard
Classifier

Sayan
Samanta

Recap

Database

Exploratory
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Analysis

Cross

Validation
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Cross
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Random
Forests

XGBoost

AdaBoost

Outlook

Spotify Billboard Classifier

Course Project: DATA 1030 - Hands On Machine Learning

Sayan Samanta



Instructor: Dr. Andras Zsom

TA Advisor: Natalie Delworth

GitHub Repo: shorturl.at/BEN08



Recap: Looking at the Database

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	acousticness	album_id	artist_id	billboard
0	0.00784	2Auw0pTT6EcQdvHNimhLQI	04gDigrS5kc9YwfZHwBETP	1.0
1	0.05910	2Auw0pTT6EcQdvHNimhLQI	04gDigrS5kc9YwfZHwBETP	1.0
2	0.28400	2Auw0pTT6EcQdvHNimhLQI	04gDigrS5kc9YwfZHwBETP	1.0

	danceability	date	duration_ms	energy	id
0	0.532	2015-05-15	238200.0	0.599	1m39XApXHXb2UkGItyyIU0
1	0.748	2015-05-15	235493.0	0.788	2iuZJX9X9P0GKaE93xcPjk
2	0.501	2015-05-15	203453.0	0.704	13YQutqrAhT5iX9H0ctu5

	instrumentalness	key	length	liveness	loudness	mode	speechiness
0	0.0	6.0	12.0	0.1400	-6.543	1.0	0.0333
1	0.0	1.0	12.0	0.0863	-7.055	1.0	0.0334
2	0.0	3.0	12.0	0.1550	-5.640	1.0	0.0326

	tempo	time_signature	track_length	valence
0	130.019	4.0	225984.25	0.113
1	120.076	4.0	225984.25	0.884
2	97.039	4.0	225984.25	0.270

Figure: Sample data with Features



Recap: Exploratory Data Analysis

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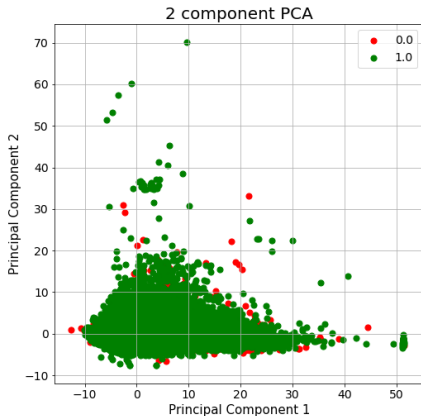


Figure: The 1st two principal component

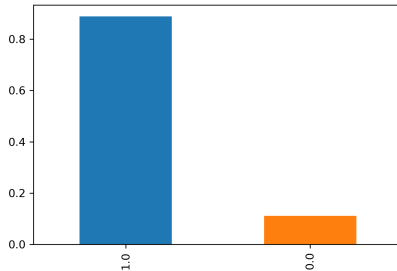


Figure: Balance of the dataset



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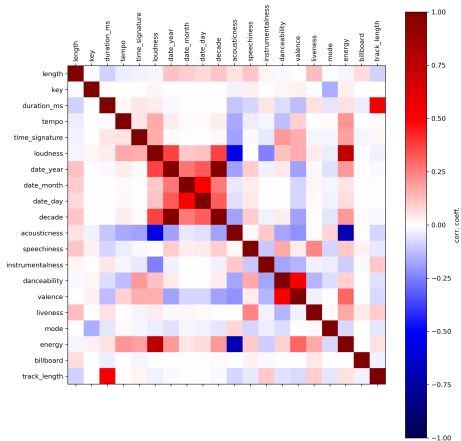


Figure: Correlation of features



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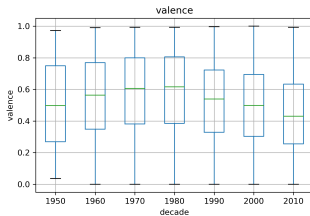


Figure: Valence evolution with time

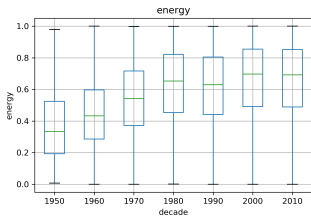


Figure: Energy evolution with time

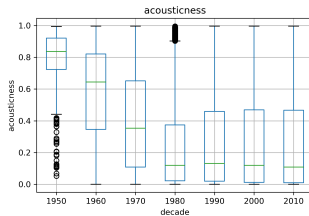


Figure: Acousticness evolution with time



Cross Validation

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- 1 Since the dataset is highly imbalanced, we use stratified KFold split.

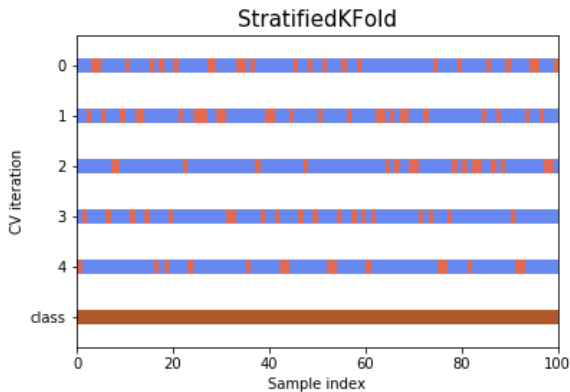


Figure: Different KFold Splits



Classification Models

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Random Forest

Parameters tuned:

Parameter Name	Parameter Range	Optimal Parameter
max_depth	1, 2 ... 10	10
min_sample_split	1, 2 ... 10	3

XGBoost

Parameters tuned:

Parameter Name	Parameter Range	Optimal Parameter
max_depth	3, 4, 5, 6, 8, 10, 12, 15	15
min_child_weight	1, 3, 5, 7	3
gamma	0.0, 0.1, 0.2 , 0.3, 0.4	0.4

AdaBoost

Parameters tuned:

Parameter Name	Parameter Range	Optimal Parameter
learning_rate	$10^{-3}, \dots, 10^4$	0.1
algorithm	SAMME.R and SAMME	SAMME.R



Results: RandomForest

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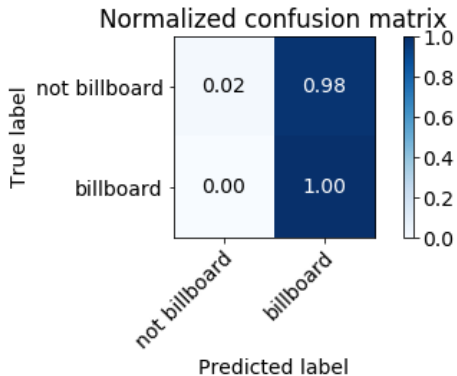


Figure: Confusion Matrix for Random Forest

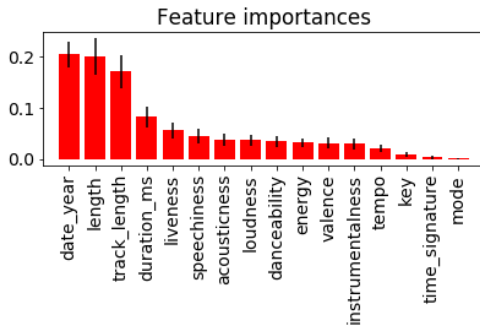


Figure: Feature Importance for Random Forest



Results: XGBoost

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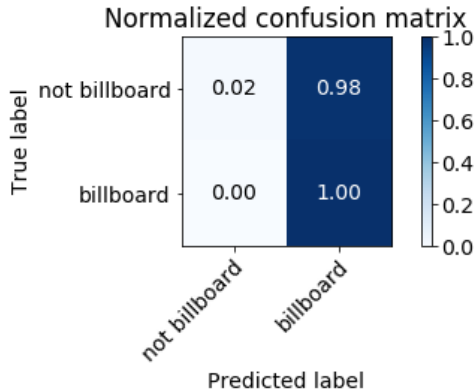


Figure: Confusion Matrix for XGBoost

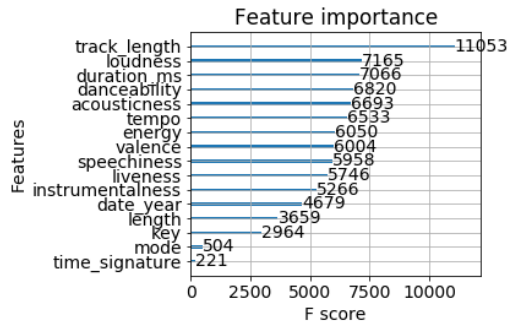


Figure: Feature Importance for XGBoost



Results: AdaBoost

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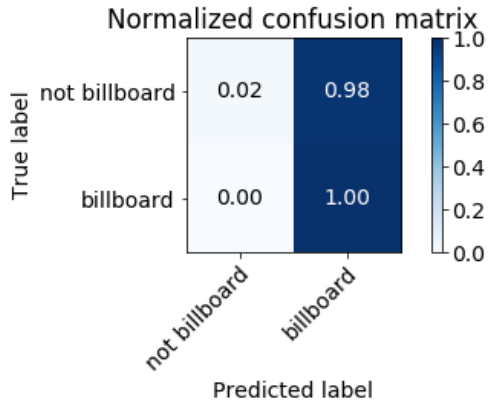


Figure: Confusion Matrix for AdaBoost

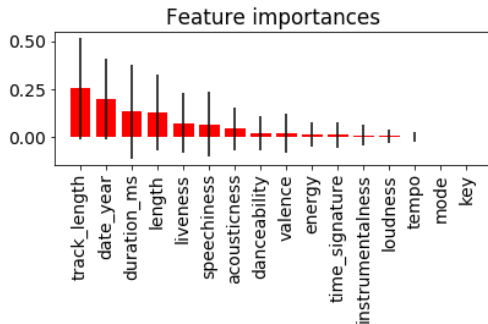


Figure: Feature Importance for AdaBoost



Results: AdaBoost

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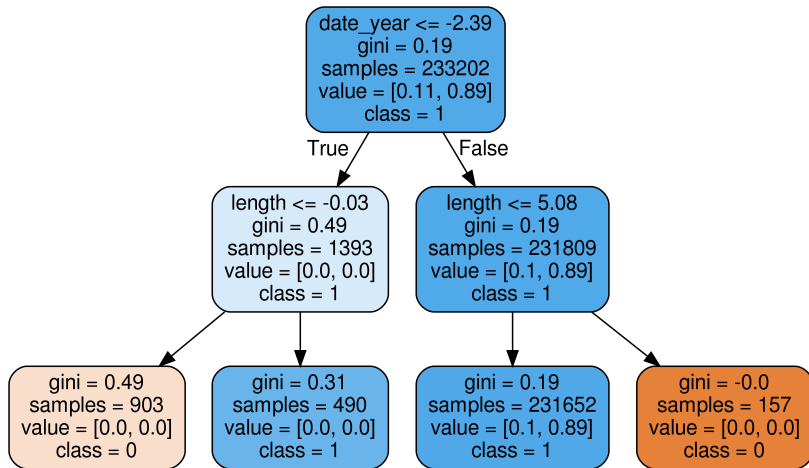


Figure: Estimator with least error



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Outlook

- The dataset was highly imbalanced. Having a much more evenly divided set among the classes would improve the results.
- The acoustic features of songs in both the classes overlap highly. Different data mining algorithm might do better
- Due to lack of time, certain methods such as support vector machine classification or K-nearest neighbours couldnt be implemented
- Advanced deep-learning methods could improve the result.



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Thank You. Question?