# **HW3-classification**

#### 音頻特徵處理:

|       | danceability | energy       | key          | loudness     | mode         | speechiness  | acousticness | instrumentalness | liveness     | valence      | tempo        | duration_ms   | time_signature |
|-------|--------------|--------------|--------------|--------------|--------------|--------------|--------------|------------------|--------------|--------------|--------------|---------------|----------------|
| count | 42305.000000 | 42305.000000 | 42305.000000 | 42305.000000 | 42305.000000 | 42305.000000 | 42305.000000 | 42305.000000     | 42305.000000 | 42305.000000 | 42305.000000 | 42305.000000  | 42305.000000   |
| mean  | 0.639364     | 0.762516     | 5.370240     | -6.465442    | 0.549462     | 0.136561     | 0.096160     | 0.283048         | 0.214079     | 0.357101     | 147.474056   | 250865.846685 | 3.972580       |
| std   | 0.156617     | 0.183823     | 3.666145     | 2.941165     | 0.497553     | 0.126168     | 0.170827     | 0.370791         | 0.175576     | 0.233200     | 23.844623    | 102957.713571 | 0.268342       |
| min   | 0.065100     | 0.000243     | 0.000000     | -33.357000   | 0.000000     | 0.022700     | 0.000001     | 0.000000         | 0.010700     | 0.018700     | 57.967000    | 25600.000000  | 1.000000       |
| 25%   | 0.524000     | 0.632000     | 1.000000     | -8.161000    | 0.000000     | 0.049100     | 0.001730     | 0.000000         | 0.099600     | 0.161000     | 129.931000   | 179840.000000 | 4.000000       |
| 50%   | 0.646000     | 0.803000     | 6.000000     | -6.234000    | 1.000000     | 0.075500     | 0.016400     | 0.005940         | 0.135000     | 0.322000     | 144.973000   | 224760.000000 | 4.000000       |
| 75%   | 0.766000     | 0.923000     | 9.000000     | -4.513000    | 1.000000     | 0.193000     | 0.107000     | 0.722000         | 0.294000     | 0.522000     | 161.464000   | 301133.000000 | 4.000000       |
| max   | 0.988000     | 1.000000     | 11.000000    | 3.148000     | 1.000000     | 0.946000     | 0.988000     | 0.989000         | 0.988000     | 0.988000     | 220.290000   | 913052.000000 | 5.000000       |

'danceability': 適合跳舞的, A value of 0.0 is least danceable and 1.0 is most danceable

'energy': a perceptual measure of intensity and activity.

'key': 音調, If no key was detected, the value is -1.

'loudness': 音量, The overall loudness of a track in decibels (dB)

'mode': modality (major or minor) of a track. Major is represented by 1 and minor is 0.

'speechiness': the presence of spoken words in a track.(the closer to 1.0 the attribute value)

'acousticness': 1.0 represents high confidence the track is acoustic.

'instrumentalness' : whether a track contains no vocals. The closer the instrumentalness value is to 1.0

'liveness': Detects the presence of an audience in the recording

'valence': 1.0 describing the musical positiveness conveyed by a track.=>sound more positive

'tempo': The overall estimated tempo of a track in beats per minute (BPM).

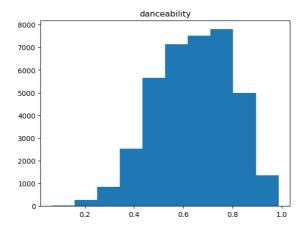
'duration\_ms': 歌曲的持續時間

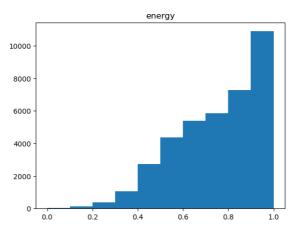
'time\_signature': 這種拍號表示以四分音符為一拍,每小節有四拍

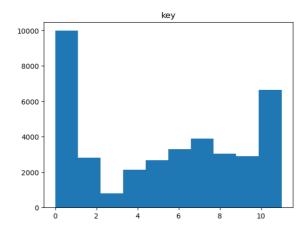
遺失值:

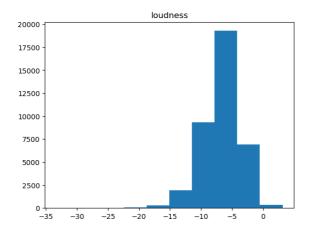
song\_name : 20786  $^{\backprime}$  Unnamed: 0  $\,$  : 21525  $^{\backprime}$  title : 21525

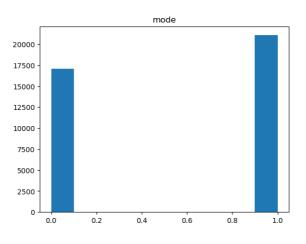
移除資料中重複值後,剩下的資料不存在遺失值。

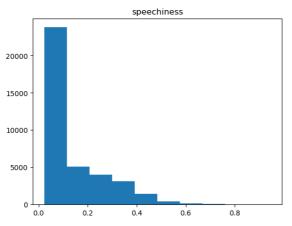


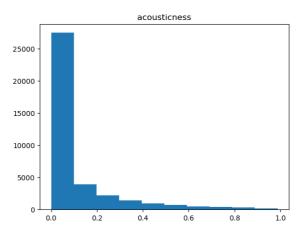


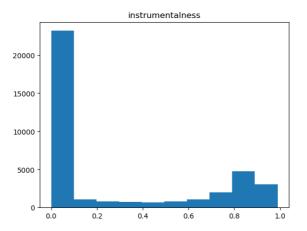


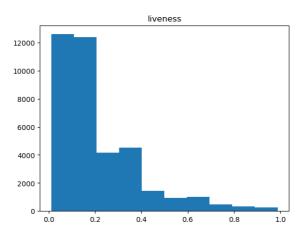


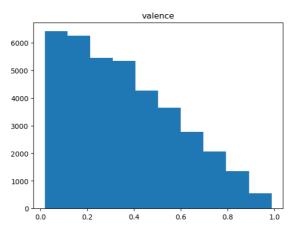


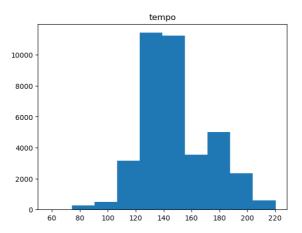


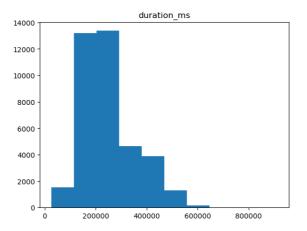


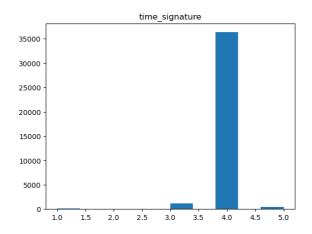












## 數據預處理:

One-Hot Encoding (將 time\_signature, mode 轉成數值化)

genre 轉成 Label

smote 處理資料不平衡

| 類別              | 原始數據數量 | SMOTE 後數量 |
|-----------------|--------|-----------|
| Underground Rap | 5771   | 5771      |
| Dark Trap       | 4518   | 5771      |
| Hiphop          | 2960   | 5771      |
| trance          | 2734   | 5771      |
| techno          | 2632   | 5771      |
| psytrance       | 2610   | 5771      |
| dnb             | 2407   | 5771      |
| hardstyle       | 2277   | 5771      |
| trap            | 2226   | 5771      |
| techhouse       | 2192   | 5771      |
| RnB             | 2039   | 5771      |
| Trap Metal      | 1897   | 5771      |
| Rap             | 1809   | 5771      |
| Emo             | 1601   | 5771      |
| Pop             | 452    | 5771      |

## 1. Random Forest分析:

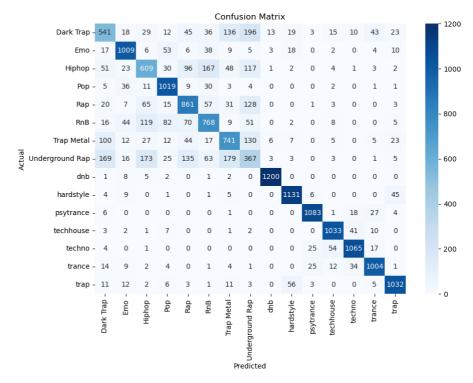
- Cross-Validation : use k = 5
  - Cross-Validation average Accuracy: 0.7567
- Random Forest
  - parameters : n\_estimators=100 \ max\_depth=30
  - Train Accuracy: 0.9700
  - Cross-Validation Accuracy: [0.75720165 0.76398816 0.76086643 0.76375451 0.76245487]
    Cross-Validation Accuracy: 0.7804
  - o classification report

| 類別              | Precision | Recall | F1-score | Support |
|-----------------|-----------|--------|----------|---------|
| Dark Trap       | 0.57      | 0.47   | 0.52     | 1139    |
| Emo             | 0.87      | 0.89   | 0.88     | 1180    |
| Hiphop          | 0.62      | 0.6    | 0.61     | 1154    |
| Pop             | 0.84      | 0.95   | 0.89     | 1121    |
| Rap             | 0.71      | 0.72   | 0.72     | 1191    |
| RnB             | 0.7       | 0.7    | 0.7      | 1174    |
| Trap Metal      | 0.65      | 0.72   | 0.68     | 1129    |
| Underground Rap | 0.35      | 0.3    | 0.32     | 1142    |
| dnb             | 0.98      | 0.98   | 0.98     | 1219    |
| hardstyle       | 0.93      | 0.95   | 0.94     | 1202    |
| psytrance       | 0.95      | 0.95   | 0.95     | 1140    |
| techhouse       | 0.91      | 0.94   | 0.93     | 1100    |
| techno          | 0.91      | 0.91   | 0.91     | 1166    |
| trance          | 0.91      | 0.92   | 0.91     | 1111    |
| trap            | 0.91      | 0.92   | 0.92     | 1145    |
| Accuracy        |           |        | 0.8      | 17313   |
| Macro avg       | 0.79      | 0.8    | 0.79     | 17313   |
| Weighted avg    | 0.79      | 0.8    | 0.79     | 17313   |

- 可看出 Underground Rap 的分類結果最差 · f1 score 僅有 32 %
  - Underground Rap只一種饒舌音樂事業的面象·它不是一種style·它是聽不出來的(from ptt)
- dnb 的分類結果最好 · f1 score 為 98 %

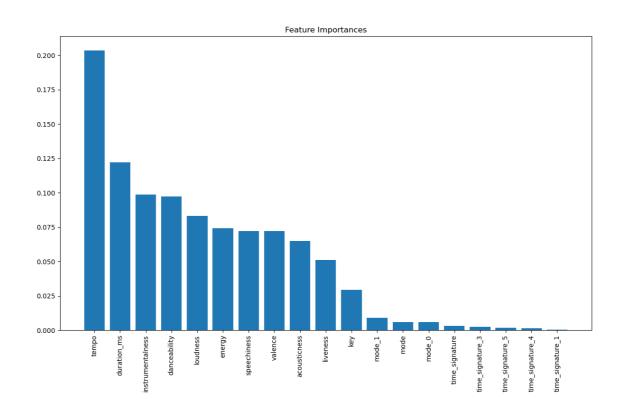
## o confusion matrix :

- 附圖可看出 Dark Trap、Trap Metal 風格相近; Hiphop、RnB 風格較相近, 易被分錯
- Underground Rap 的風格較不明確
- 其餘類別音樂特徵明確,準確率高



#### • feature selection:

■ 以 tempo、duration\_min、instrumentalness、danceability、loudness 為前五重要特徵

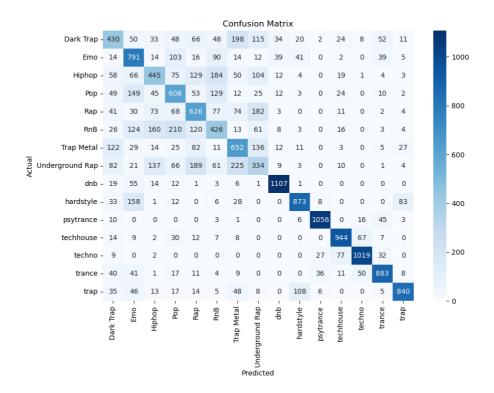


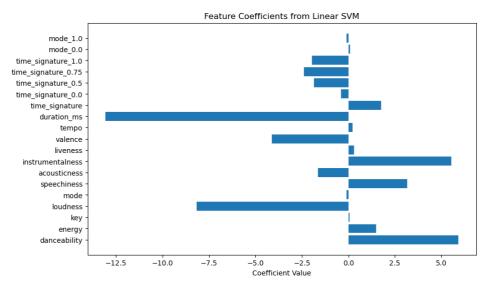
# 2.SVC

• Cross\_val Scores: [0.6374 0.6346 0.6357]

Train Accuracy(average): 0.6359

• Test Accuracy: 0.6372





#### · classification report

- psytrance 為分類結果最佳之類別 · F1 score 達0.93; Underground Rap 仍為結果最差之音樂類 別 · F1 score 僅有0.32 ·
- 平均而言·SVM 方法分類結果較隨機森林差。

|                 | precision | recall | f1-score | support |
|-----------------|-----------|--------|----------|---------|
|                 |           |        |          |         |
| Dark Trap       | 0.44      | 0.38   | 0.41     | 1139    |
| Emo             | 0.50      | 0.67   | 0.58     | 1180    |
| Hiphop          | 0.47      | 0.39   | 0.42     | 1154    |
| Рор             | 0.47      | 0.54   | 0.50     | 1121    |
| Rap             | 0.47      | 0.53   | 0.50     | 1191    |
| RnB             | 0.40      | 0.36   | 0.38     | 1174    |
| Trap Metal      | 0.49      | 0.58   | 0.53     | 1129    |
| Underground Rap | 0.34      | 0.29   | 0.32     | 1142    |
| dnb             | 0.90      | 0.91   | 0.90     | 1219    |
|                 |           |        |          |         |

| hardstyle    | 0.81 | 0.73 | 0.77 | 1202  |
|--------------|------|------|------|-------|
| psytrance    | 0.93 | 0.93 | 0.93 | 1140  |
| techhouse    | 0.83 | 0.86 | 0.84 | 1100  |
| techno       | 0.88 | 0.87 | 0.88 | 1166  |
| trance       | 0.81 | 0.79 | 0.80 | 1111  |
| trap         | 0.85 | 0.73 | 0.79 | 1145  |
|              |      |      |      |       |
| accuracy     |      |      | 0.64 | 17313 |
| macro avg    | 0.64 | 0.64 | 0.64 | 17313 |
| weighted avg | 0.64 | 0.64 | 0.64 | 17313 |
|              |      |      |      |       |