# PROJECTION OF ACOUSTIC FEATURES TO CONTINUOUS VALENCE-AROUSAL MOOD LABELS VIA REGRESSION

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#### **ABSTRACT**

The problem of organizing music by emotional content or mood is not only difficult to solve computationally, but often lacks well-defined answers. In previous work, we have presented a collaborative game, MoodSwings [1], which records dynamic (per-second) labels of players ratings of music using the valence-arousal model.

Using a small subset of the MoodSwings data, we are currently investigating the projection of various acoustic features to valence-arousal point values using regression, as opposed to discretizing emotional space into a finite number of classes [2]. We demonstrate preliminary results that indicate the effectiveness of the regression-based approach in taking advantage of the continuous range of the underlying valence-arousal space. Our data collection consists of 120, 15-second song clips, which have been selected a priori to approximate an even distribution across the four primary quadrants of the valence-arousal space.

Using least-squares regression, the system is trained to project the mean of the acoustic features to the mean valence-arousal value for each 15-second music clip. Using a combination of MFCCs and spectral shape features we show that the least-squares projection results in an average deviation of only 16.03% from the mean labels of the testing samples. We compare the Euclidean distances from the projected valence-arousal points to the mean collected labels (which are assumed to represent ground truth) to baseline distances resulting from a random permutation of the ground truth. Comparing these cases over 50 cross-validations, we compute the Student's T-test to demonstrate the statistical significance of our results.

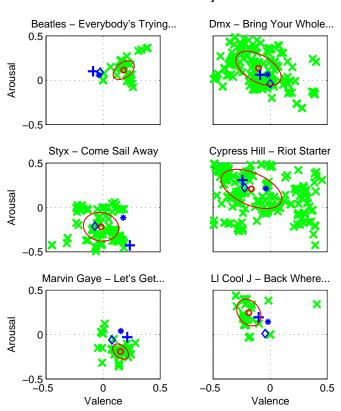
Feature	Avg. Distance	Avg. Rand. Dist.	T-test
MFCC	$0.180 \pm 0.015$	$0.273 \pm 0.020$	26.610
S. Shape	$0.179 \pm 0.014$	$0.256 \pm 0.018$	24.292
S. Contrast	$0.161 \pm 0.014$	$0.274 \pm 0.024$	28.614
Chroma	$0.233 \pm 0.016$	$0.241 \pm 0.017$	2.5547
MFCC + S.S.	$0.160 \pm 0.012$	$0.278 \pm 0.024$	31.010

Table 1. Emotion regression of MoodSwings Data.

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## Collected Labels vs Labels Projected From Features



**Figure 1**. Labels collected for song (x),  $\mu$  of collected labels (red o),  $\sigma$  of collected labels (red ellipse), MFCC-only projection (\*), spectral shape projection ( $\diamond$ ), and MFCC+spectral shape projection (+).

### 1. REFERENCES

- [1] Y. Kim, E. Schmidt, and L. Emelle. Moodswings: A collaborative game for music mood label collection. In *Proc. International Conference on Music Information Retrieval*, Philadelphia, PA, September 2008.
- [2] L. Lu, D. Liu, and H. J. Zhang. Automatic mood detection and tracking of music audio signals. *IEEE Transactions on Audio, Speech, and Language Processing*, 14(1):5–18, 2006.