



## Extraction of emotional information from music for Virtual Dance Collaboration System

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## Contents

1. Background and Objectives
2. Virtual Dance Collaboration System
3. Extraction of Emotional Information
4. Modification of Reactive Motion
5. Conclusion and Future Works

## Background

### ◆ Motion Capture

- Entertainment
- Medical care
- Biomechanics

### ◆ Digital Archiving and Information Technology application to dancing

- Quantitative analysis of traditional dance motion
- 3D character animations of traditional performing arts using virtual reality (VR)



Quantitative analysis of *Nihon-buyo* motion



Animation of *Noh* in VR

## Related works on interaction with body motion

### "Just Follow Me"

User can practice dance through watching a ghost-like virtual dancer displayed in the VR space

U. Yang, et al. : Implementation and Evaluation of "Just Follow Me" : An Immersive, VR-Based, Motion-Training System



### "Movement-based interactive dance performance"

Music and graphics images on the stage are modified in real-time according to the dancer's motion

J. James, et al. :  
"Movement-based interactive dance performance"



## Objectives: Virtual Dance Collaboration

### ◆ Collaboration system based on body motion

- Requirements:
  - Recognition of body motion
  - Generation of reactions
  - Representation of reactions

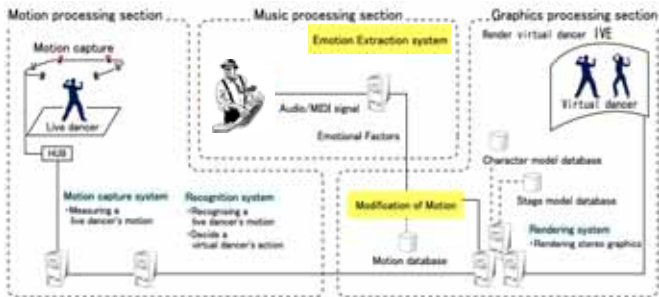
### ◆ Realize virtual dance collaboration

- Optical real-time motion capture
- Immersive VR environment
- Recognition of body motion
- Generation of reactions

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## Configuration of the system

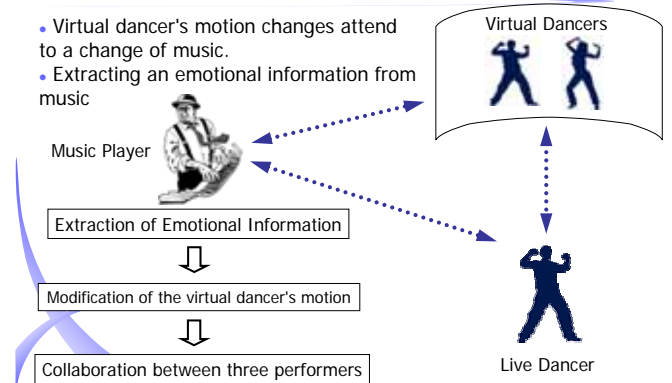


- Input live dancer's motion
- Recognizing a live dancer's motion
- Determine a virtual dancer's reaction
- Extraction of emotional information from music
- Modify virtual dancer's reactive motion
- Rendering stereoscopic character animation

## Collaboration between 3 performers

◆ The music affects dance movement

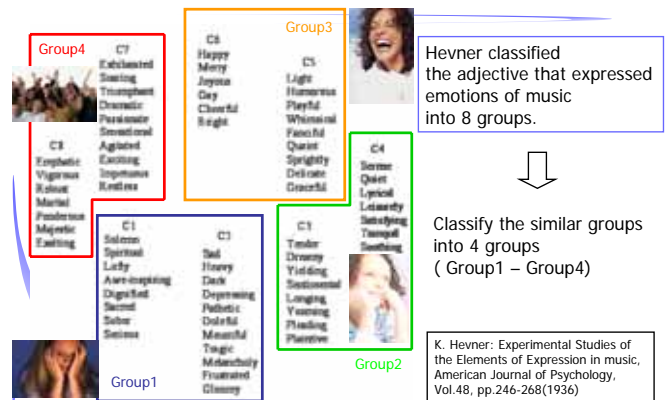
- Virtual dancer's motion changes attend to a change of music.
- Extracting an emotional information from music



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## Fundamental Research of Extraction of Emotional Information from Music



## Recording in UBC

- Song: "March" by J. Clarke
- 8 kinds of emotions (C1 – C8)



## Feature values for extraction of emotion

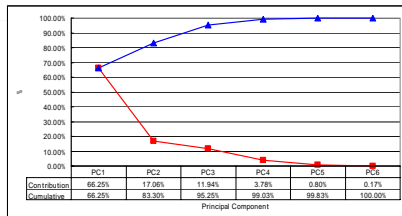
### Feature parameters

- Mean of Velocity (Power of Sound)
- Standard Deviation of Velocity
- Mean of Brightness (Harmonic overtone element)
- Standard Deviation of Brightness
- Mean of number of keys pushed in 3 seconds (Speed)
- Mean of Duration of one key

6 Feature values ⇒ Analyze by PCA

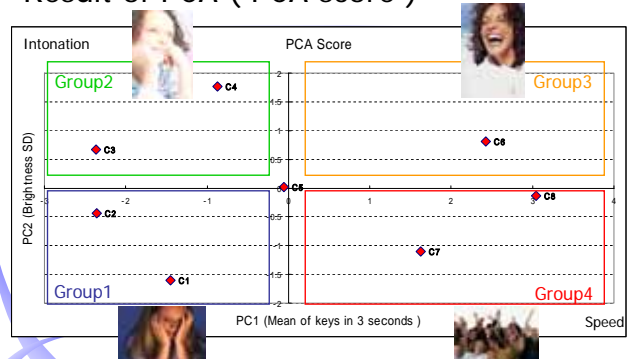
What is the most effective element for expression of emotion in music ?

## Result of PCA ( Factor loadings )



	PC1	PC2	PC3
Mean of Velocity	0.961	-0.135	0.061
Standard Deviation of Velocity	-0.603	0.448	0.655
Mean of Brightness	0.902	0.146	0.319
Standard Deviation of Brightness	0.262	0.883	-0.388
Mean of number of keys pushed in 3 seconds	0.962	-0.018	-0.017
Mean of Duration of one key	-0.939	-0.057	-0.176

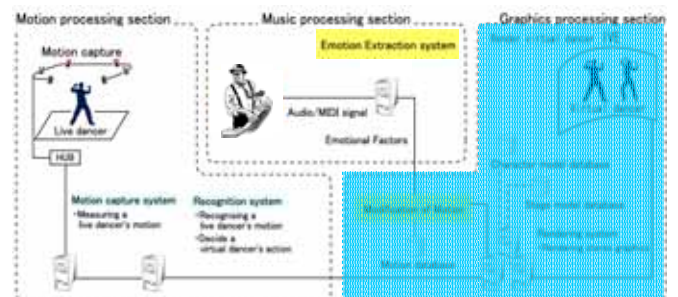
## Result of PCA ( PCA score )



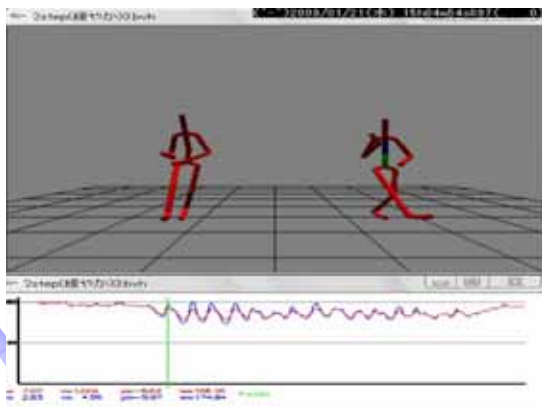
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## Modification of Virtual dancer's motion



## Experiment of motion modification



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## Conclusions and Future Works

### ◆ Conclusions

- Extraction of emotional information from music
- Modification of virtual dancer's motion

### ◆ Future works

- Recognition
  - Recognition algorithm based on HMM
- Real-time Extraction of Emotional Information
  - Find the best feature values
- Motion modification
- Collaboration
  - Virtual dancer models
  - Prediction algorithm of virtual dancer's reactive motion

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