



The Effect of Posture and Dynamics on the Perception of Emotion

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Emotional virtual characters are important for games



Dragon Age Origins, Bioware, 2009



Star Wars, Knights of the Old Republic, Bioware, 2013



Heavy Rain, Quantic Dream, 2010



Mass Effect, Bioware, 2010



The Last of Us, Naughty Dog, 2013



The Walking Dead, Telltale Games, 2013

Games primarily use motion capture for character animation

- + Efficient, computationally straightforward
- + Requires less manual effort
- + Faithfully translates performances

Relies on motion editing techniques to be adapted dynamically to game environments and scenarios



Star Wars, Knights of the Old Republic, Bioware, 2013

How does motion editing affect emotional content?

Do changes in pose and dynamics matter?

How can we preserve important aspects of a motion during editing?

Can we purposely increase, decrease, or change emotional content?

People are very good at recognizing emotions

Emotion recognition mostly invariant across cultures [Kleinsmith et al 2006; Ekman 1992] and across body types and level of realism [Pasche and Poppe 2007; McDonnell et al 2008]



McDonnell et al. 2008



Pasche and Poppe. 2007

Motion editing can affect emotion perception

Emotion simulation [Unuma et al. 1995; Amaya et al. 1996; Chi et al. 2000; Brand and Hertzmann 2000; Hsu et al. 2005; Hartmann et al. 2006; Shapiro et al. 2006; Torresani et al. 2007]

Discernible from static poses [Coulson 2004]

Sensitivity to changes in timing [Ryall et al. 2012; Reitsma and Pollard 2003; Vicovaro et al. 2012]

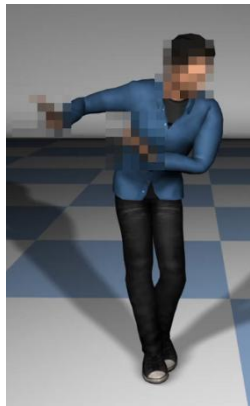
Joint flexion and dynamics differ between emotions [Roether et al 2009; Sawada et al 2003; Pollick et al 2001; Wallbot 1990]

Body language, Free-form movements

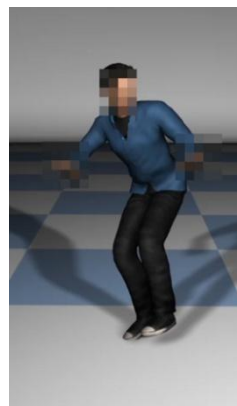
6 Emotions



Anger



Disgust



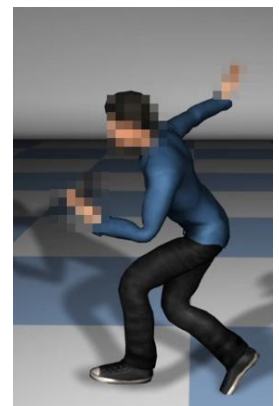
Fear



Happiness



Sadness



Surprise

Three Experiments

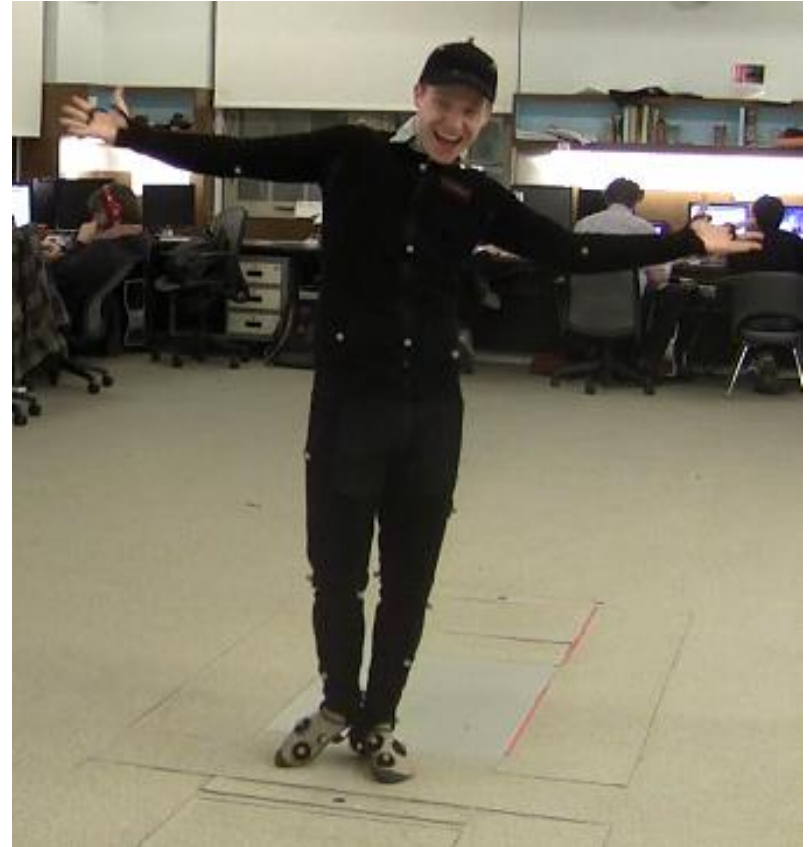
1. Analyze poses and dynamics in captured emotions. Find clips with high recognition rates.
2. What parts of the body are important for conveying emotions?
3. How do changes in pose and dynamics affect the emotion recognition and intensity?

Experiment 1: Stimuli

Analyze poses and dynamics in captured emotions

Improvised performances

55 animated clips total



Experiment 1: Method

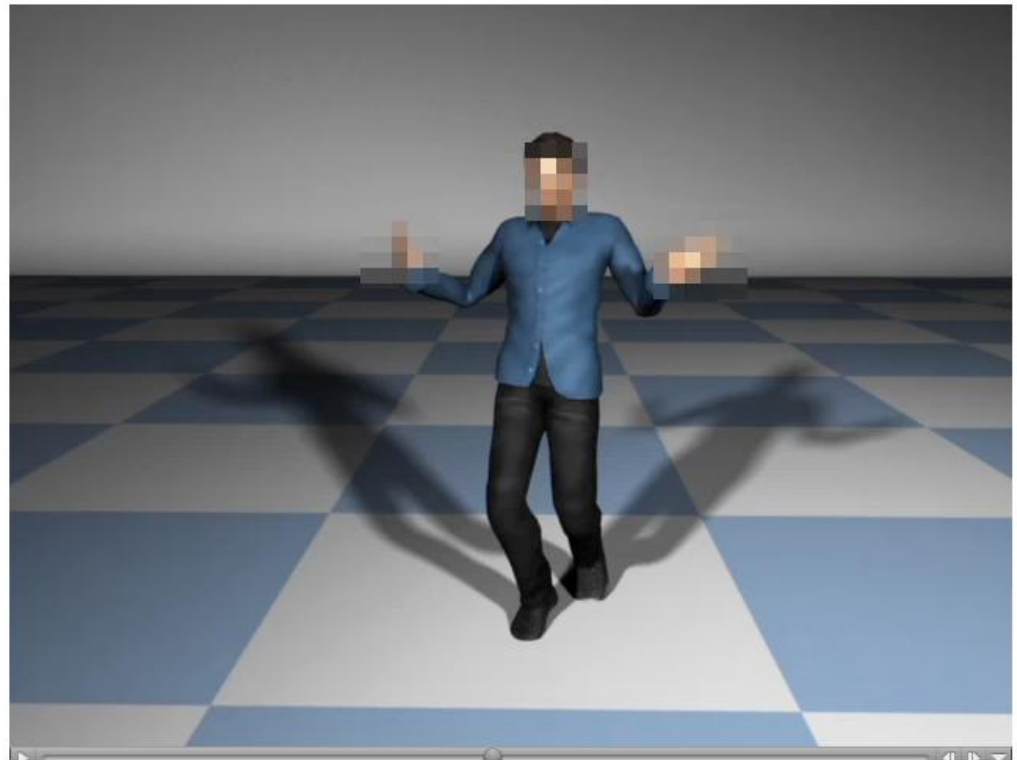
15 participants

Online survey

Randomized order

2 Questions:

- Emotion
- Intensity

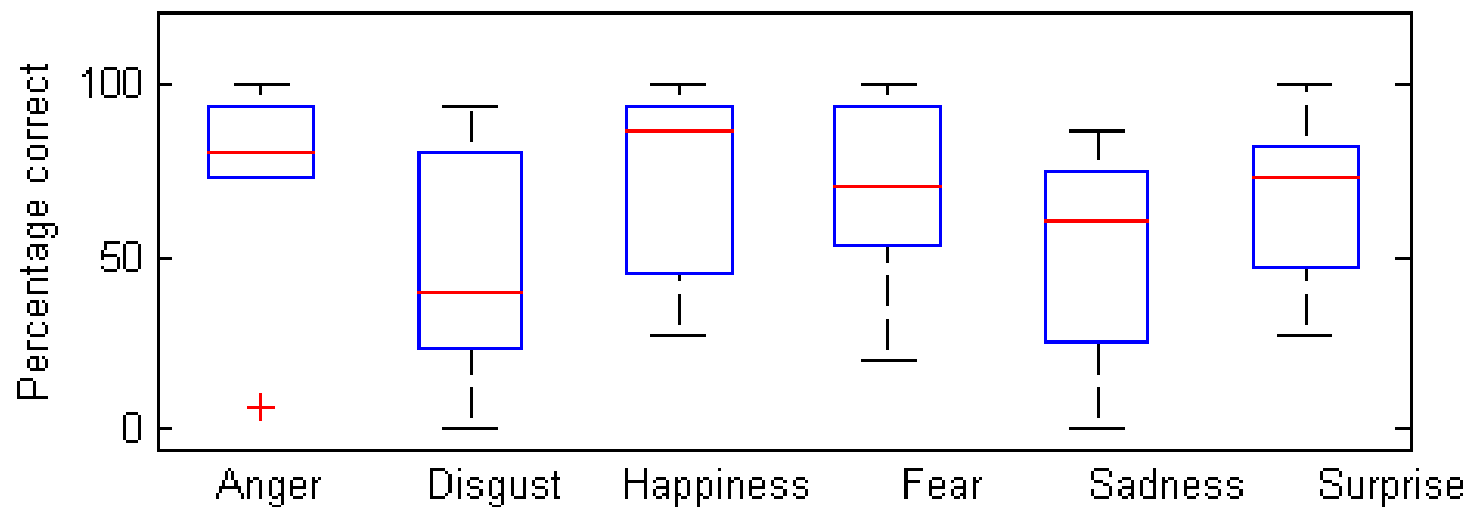


Please choose which emotion you think is being conveyed in this video:

- Happiness
- Sadness
- Anger
- Disgust
- Fear
- Surprise

>>

Experiment 1: Emotion Recognition



62.4% correct recognition across all clips

Disgust hardest to recognize, agrees with previous work [Ekman 1992; Atkinson et al. 2004]

Experiment 1: Best Recognized Clips

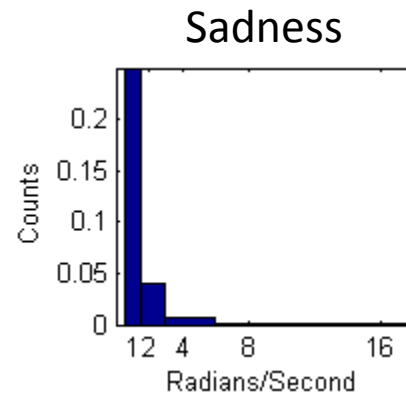
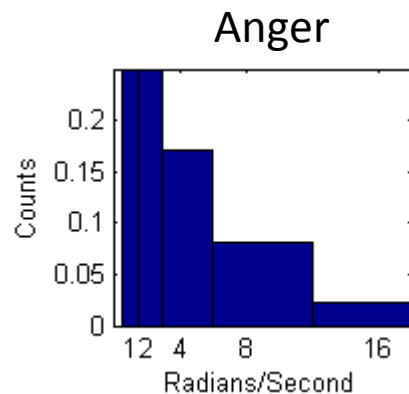


Clips with highest recognition rate for each emotion

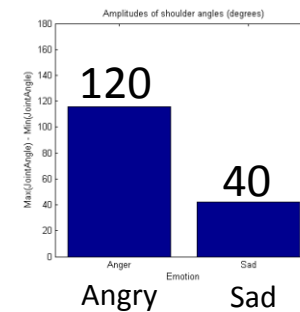
Experiment 1: Motion Analysis

Anger, happiness have *faster* joint movements;
sadness, fear are *slower*

Anger, happiness have *larger* joint amplitudes;
sadness, fear have *smaller* amplitudes



Shoulder Amplitudes



Thus, if we modify these aspects, does the perception of the emotion change?

Experiment 2

What parts of the body are important for conveying emotions?

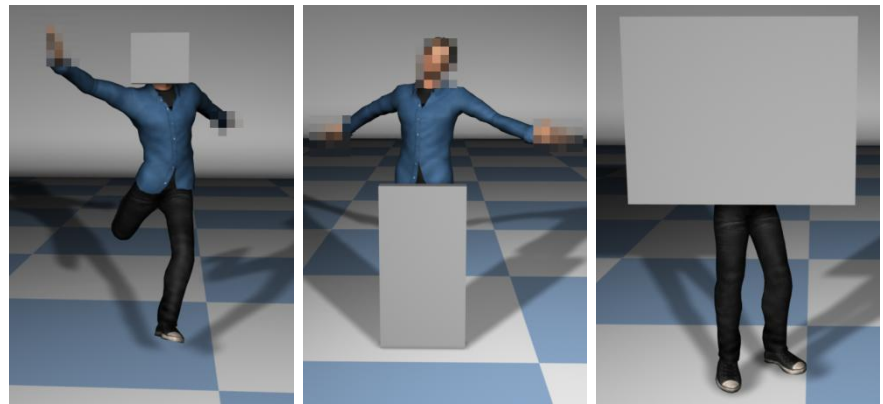
Four conditions:

No Head (NH)

No Lower Body (NL)

No Upper Body (NU)

Original



48 clips, randomized, 6s/question, two fast-paced blocks

2 Questions:

- Emotion (forced choice)
- Intensity (5-point scale)

Experiment 2: Occluded Motion Examples



Experiment 2: Analysis

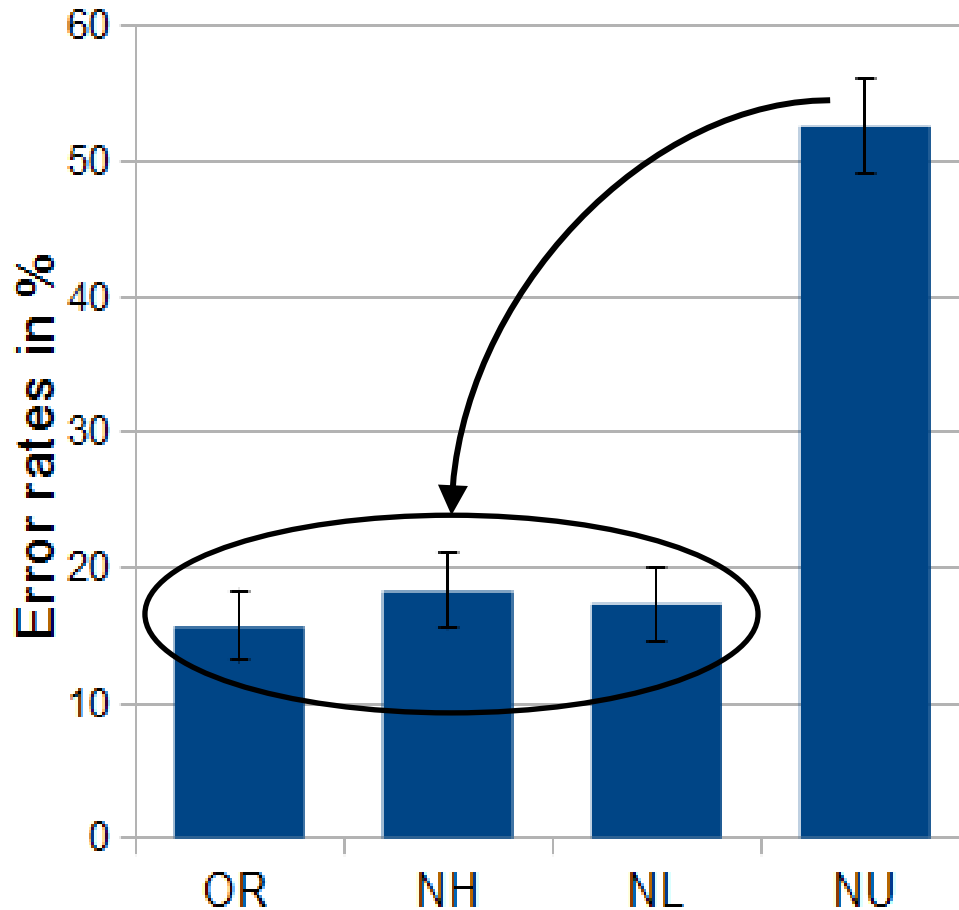
Two-way repeated measures ANOVA, factors Occlusion Type and Emotion

Main Effects of Occlusion Type ($p < 0.001$) and Emotion ($p < 0.001$)

Interaction effects between Occlusion Type and Emotion ($p < 0.001$)

Experiment 2: Emotion Recognition

13 participants



Upper body most important for conveying emotions

Experiment 2: Interaction Effects

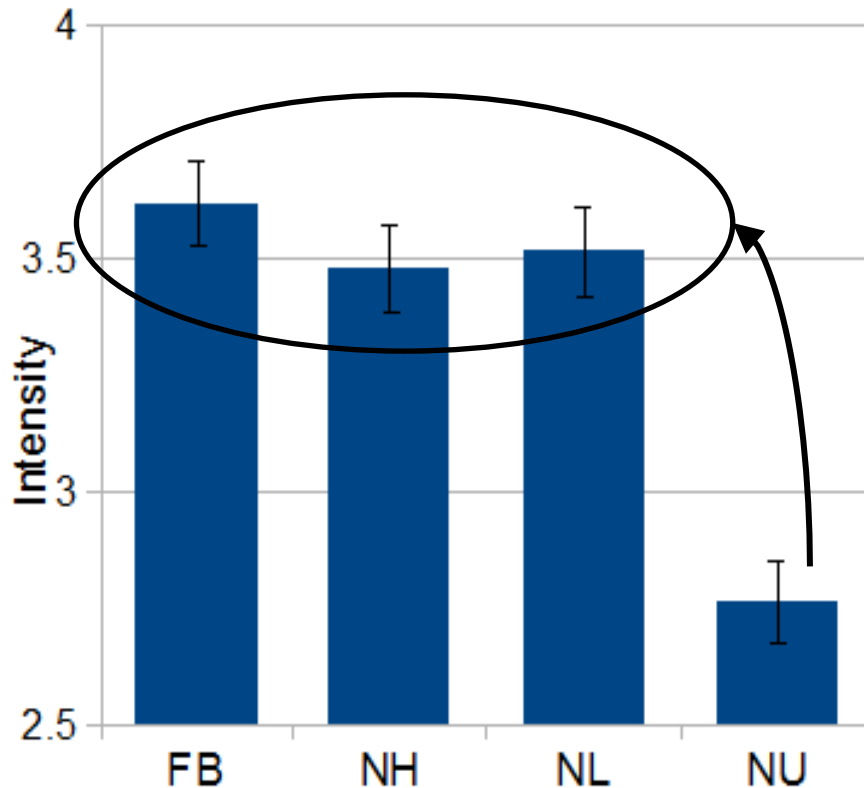
Fear had same error rates for all conditions

Sadness with NH recognized least well

Anger with NL recognized second least well

Experiment 2: Emotion Intensity

12 participants



Mirrors result for emotion recognition:

Emotions perceived as significantly less intense when upper body is missing

Intensity ranged from 1 (low) to 5 (high)

Experiment 3

How do changes in pose and dynamics effect emotion perception?

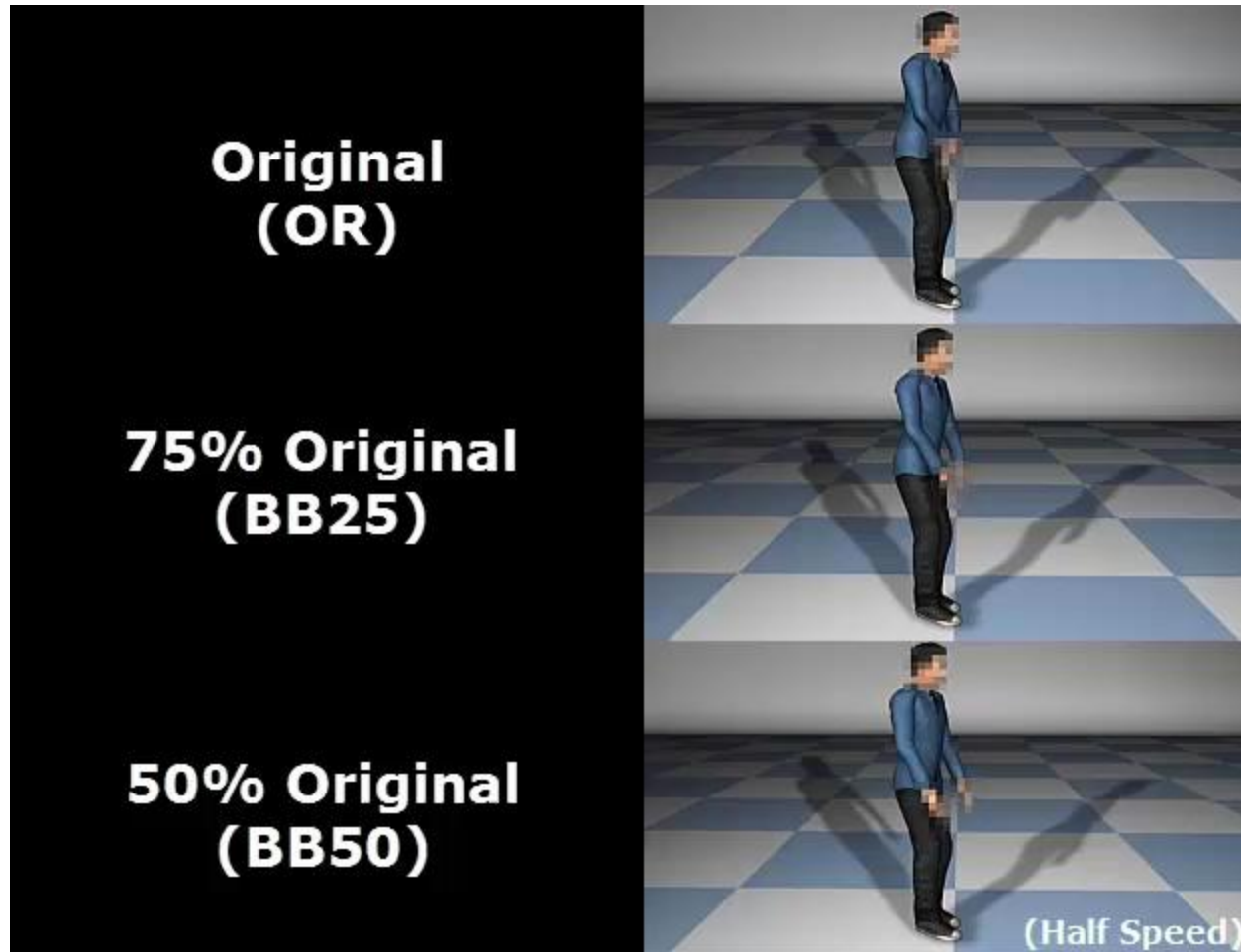
Five Conditions:

Condition	Body blend 25% (BB25)	Body blend 50% (BB50)	Offset (OFF)	Dynamic time warp (DTW)	Original
Changes dynamics	X	X		X	
Changes pose	X	X	X		

60 clips, randomized, 6s/question, watched twice in 2 fast-paced blocks

2 Questions: emotion recognition and intensity

Experiment 3: Body blend examples



Experiment 3: Offset

**Offset
Shoulders
(OFF)**



**Original
(OR)**

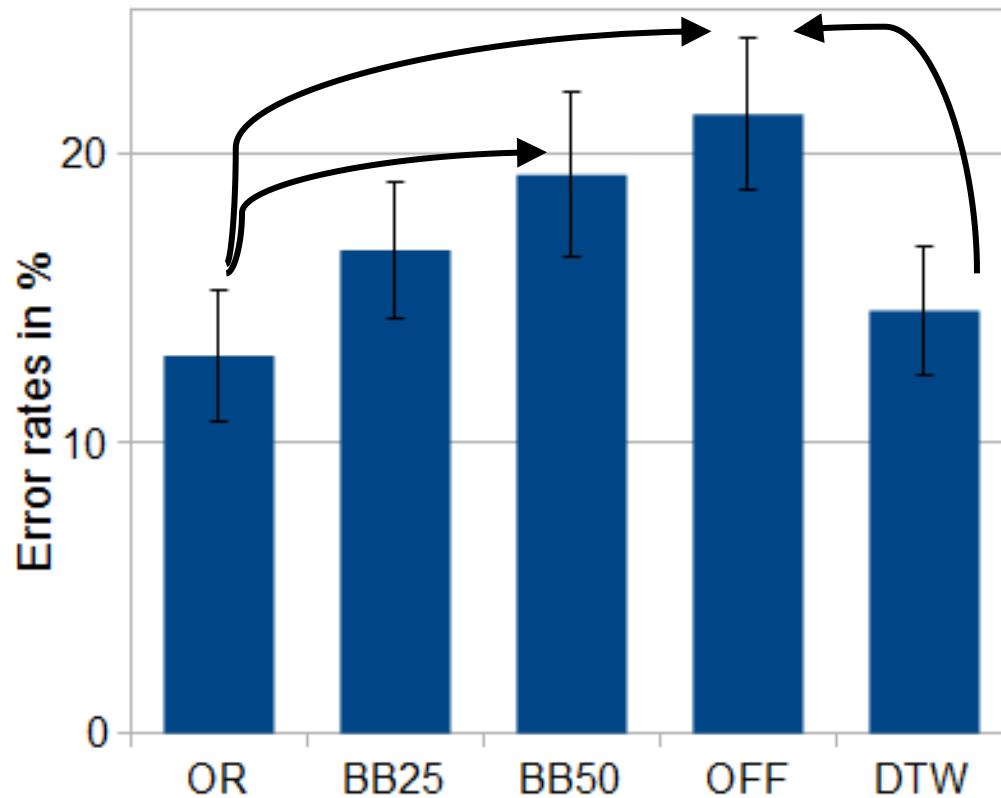


Experiment 3: Dynamic time warping



Experiment 3: Emotion Recognition

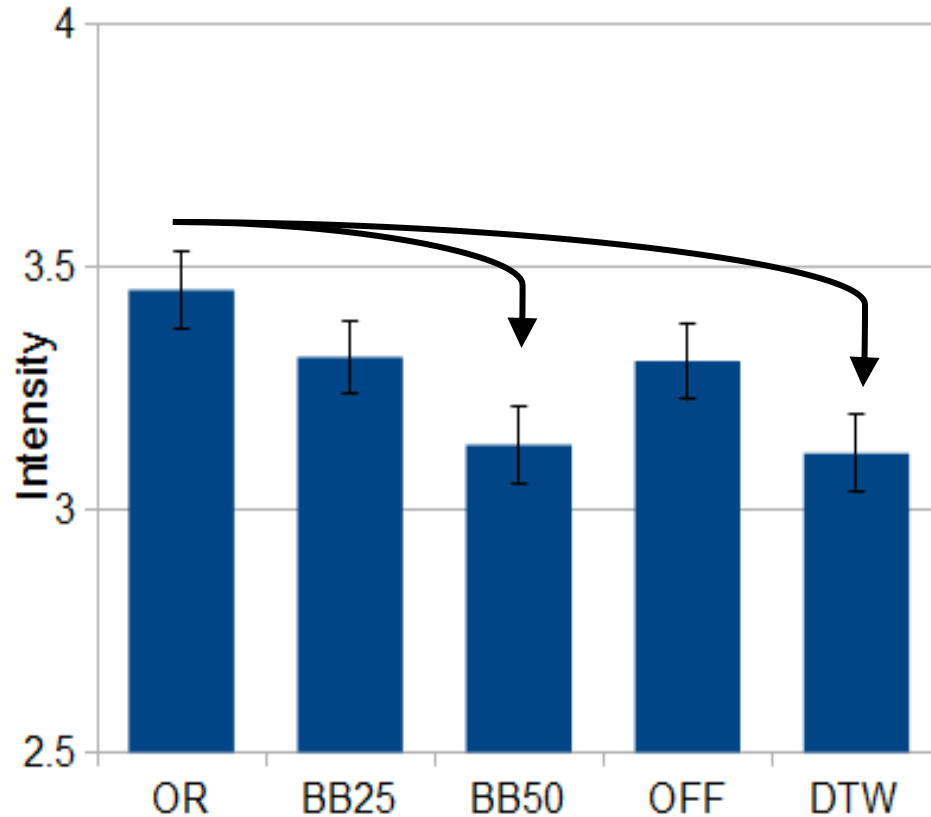
16 participants



Changing poses
affected
recognition
rates

Experiment 3: Emotion Intensity

16 participants

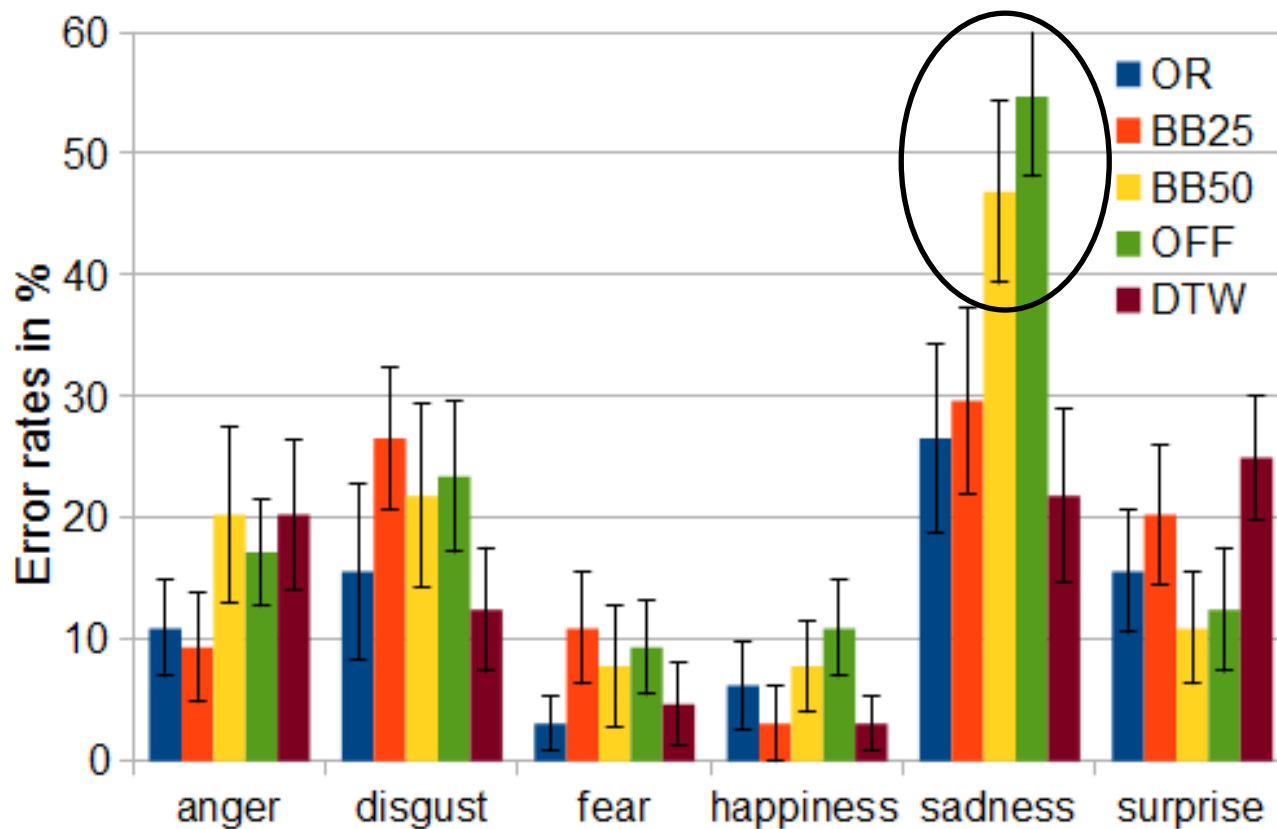


Timing changes
affects intensity

Intensity ranged from 1 (low) to 5 (high)

Experiment 3: Results hard to generalize

Must be careful: Trends not true for every emotion



Conclusion: Changes to posture and dynamics matter

Upper body most important for conveying emotion

Perceived emotional intensity reduced by blending with a neutral motion

Posture changes altered the perceived emotion

Dynamics changes altered the perceived intensity

Future Work

Test whether these findings can enhance motion editing

Test effect of other timing changes

Understand when changes to pose affects recognition and when not

Questions?



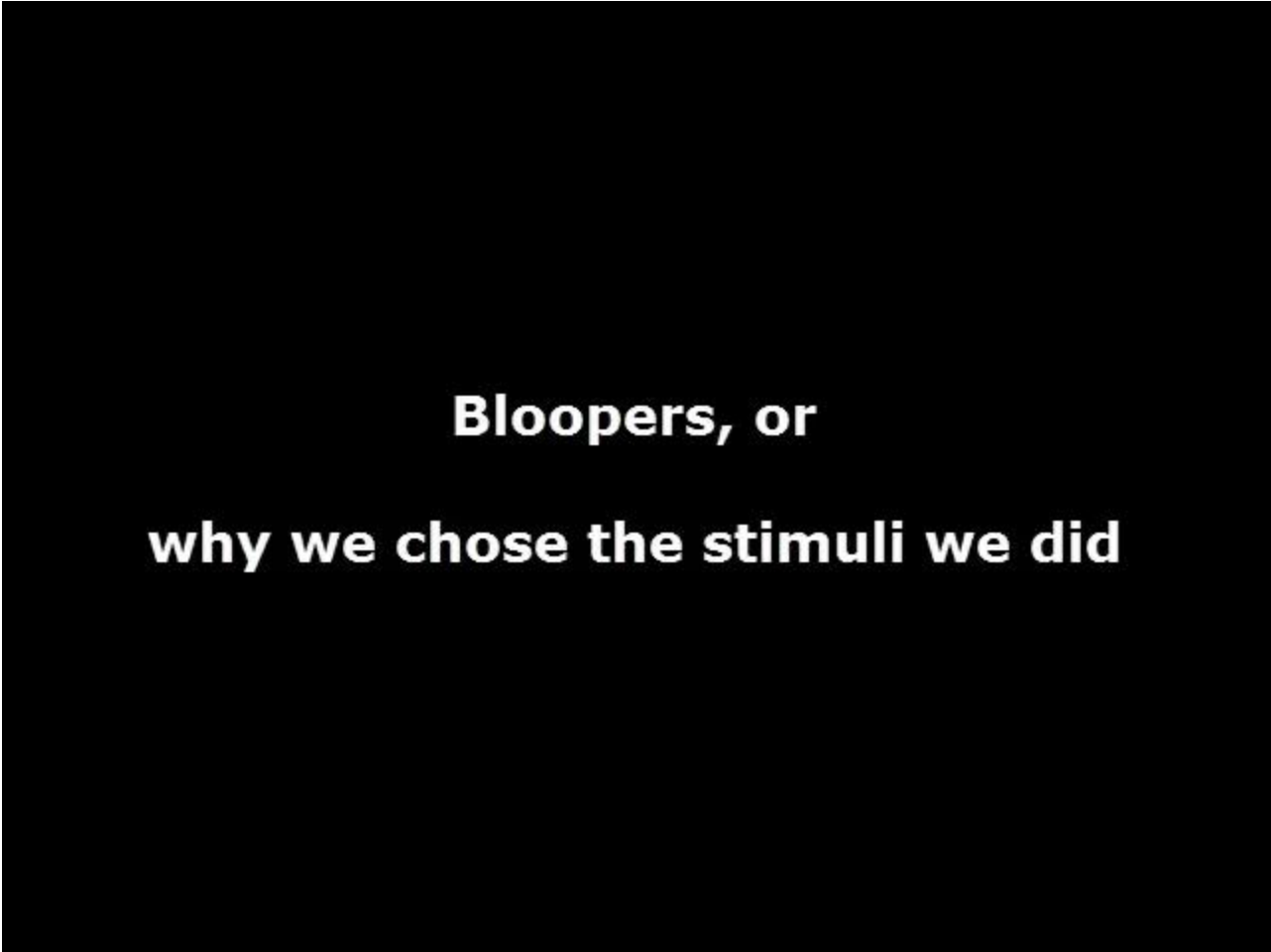
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We wish to thank Parag Acharya, NSF, our participants, and the anonymous reviewers.

Bloopers

Sometimes the best choice of stimuli is not obvious



**Bloopers, or
why we chose the stimuli we did**

Performance Capture

Actor improvised 10 performances for each emotion

Optical motion capture

22 joints

Box blur for face and hands

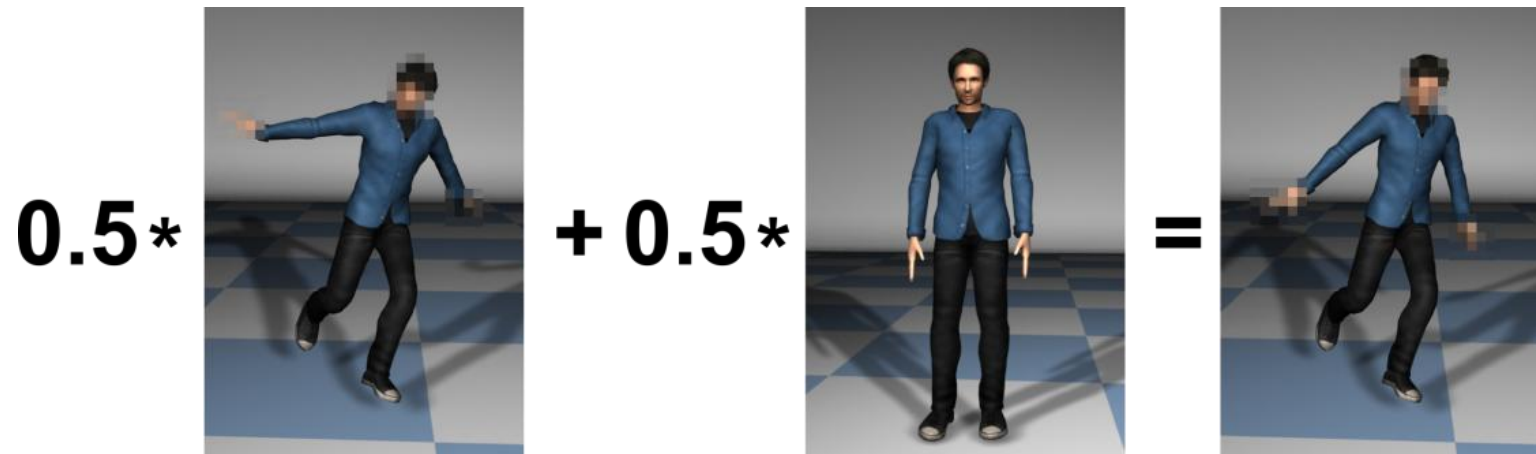


Experiment 3: Body blend

Changes pose and dynamics

BB25 retains 75% of the original upper body motion

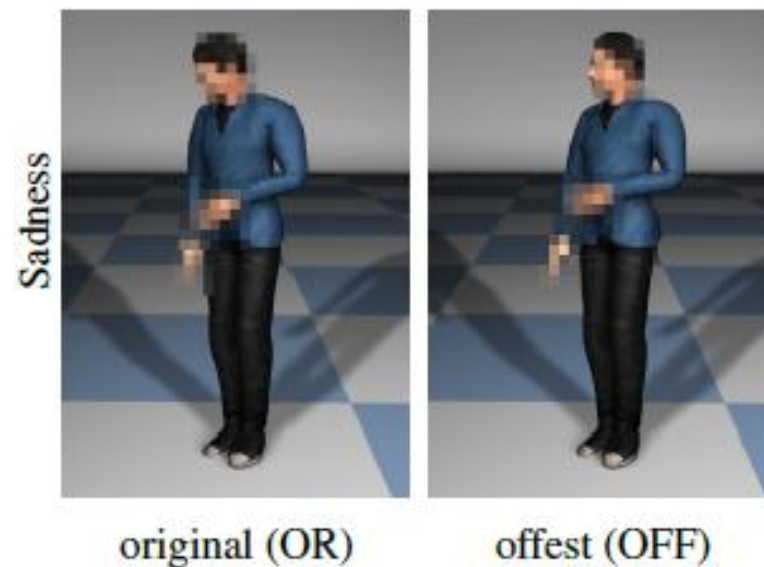
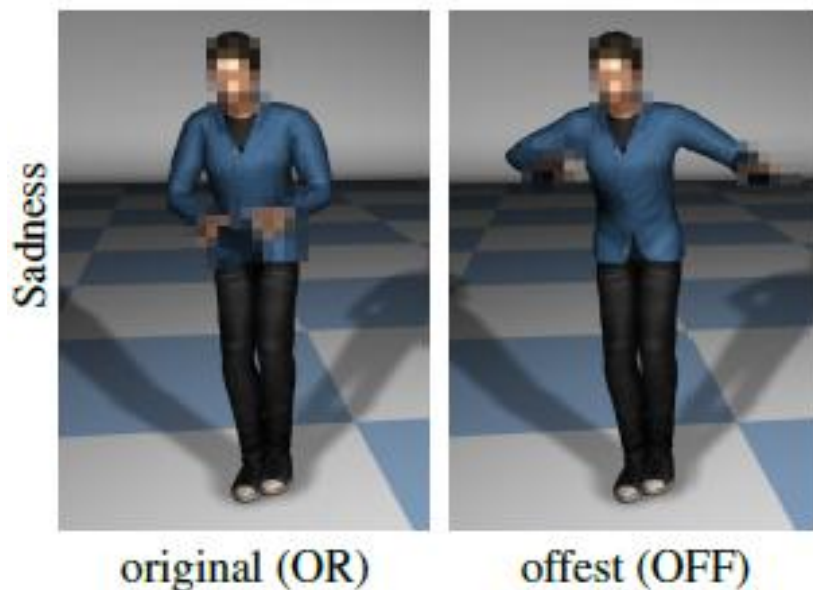
BB50 retains 50% of the original upper body motion



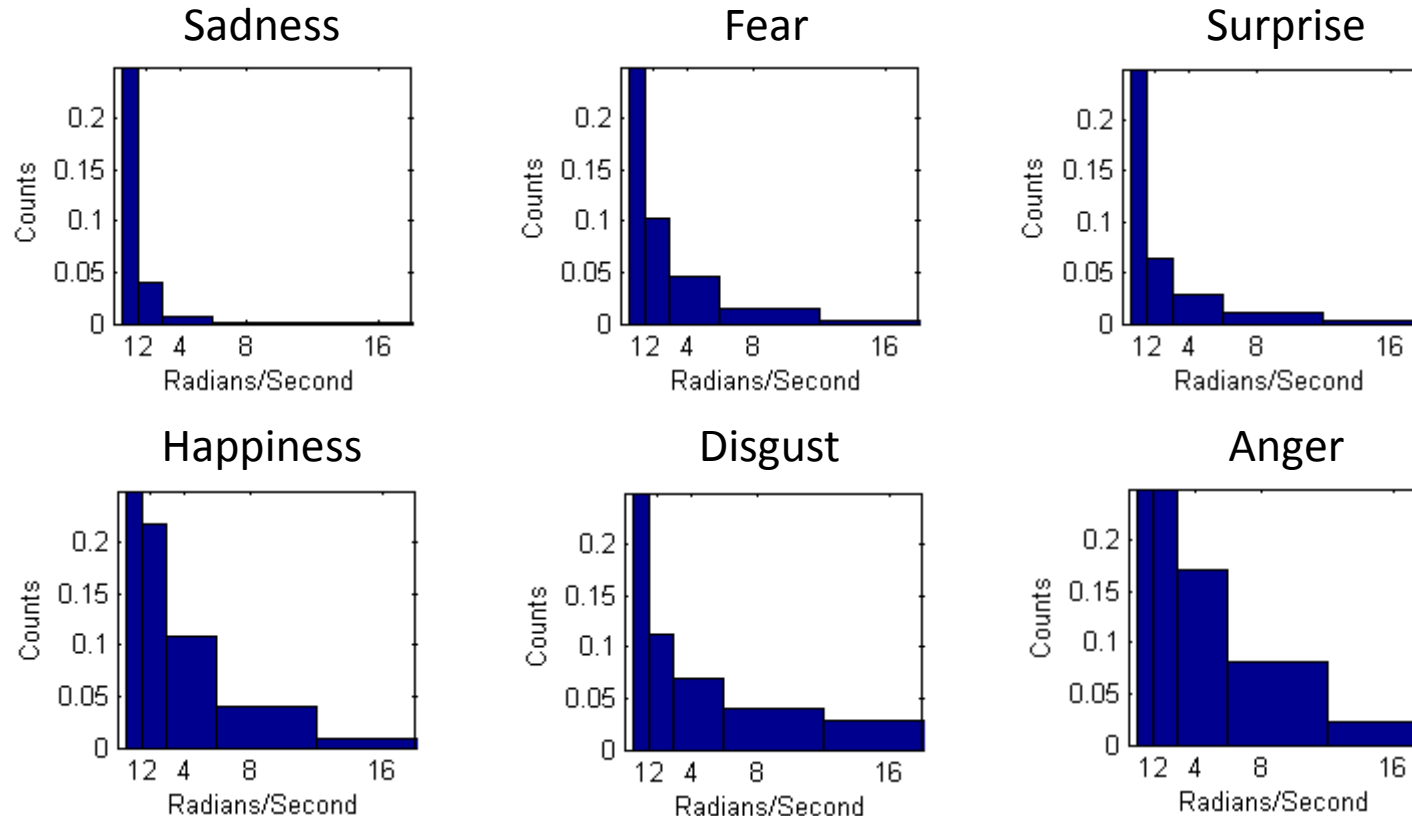
Experiment 3: Offset

Changes pose, but not dynamics

Manually edit shoulders, elbows, spine, neck



Experiment 1: Motion Analysis



Anger, happiness tend to have larger, faster joint movements; fear, sadness less, [Roether et al. 2009]