

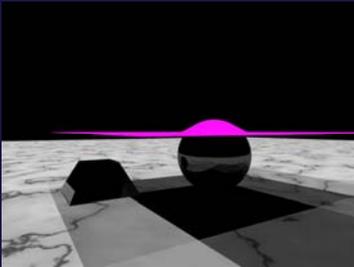
## Evaluating Human Motion

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[www.cs.cmu.edu/~jkh](http://www.cs.cmu.edu/~jkh)

## How to evaluate?

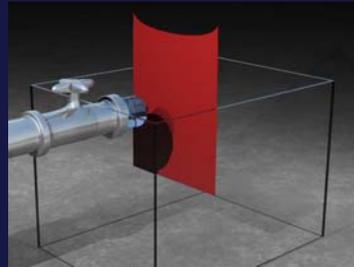
- Looks good...
- Side-by-side comparisons (~1995)
- Perceptual Studies (~1998)
  - Hodgins, O'Brien and Tumblin
  - Harrison, Rensink, van de Panne
- fMRI (recently)
- Behavioral studies
  - Immersion (used successfully in VR)
  - Enactment
  - Interference

## Looks Good?



Ron Fedkiw, Robert Bridson, and John Anderson

## Looks Good?



Ron Fedkiw, Eran Guendelman, Andrew Selle and Frank Losasso

## Looks Good?



*Wes Fesler Kicking a Football,*  
1934

Dr. Harold Edgerton

## Looks Good?

Movie

### Side-by-side Comparison

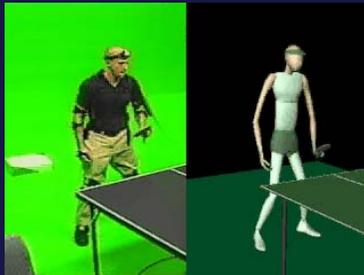


### Side-by-side Comparison



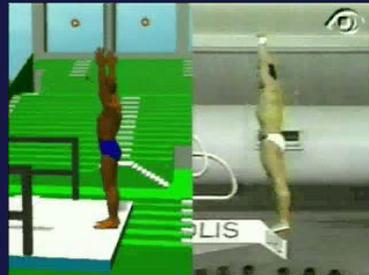
Victor Zordan

### Side-by-side Comparison



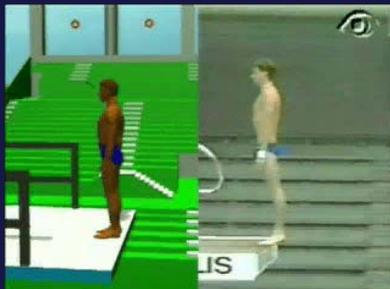
Victor Zordan

### Side-by-side Comparison



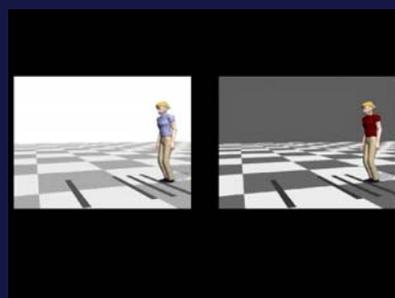
Wayne Wooten

### Side-by-side Comparison



Wayne Wooten

### Side-by-side Comparison



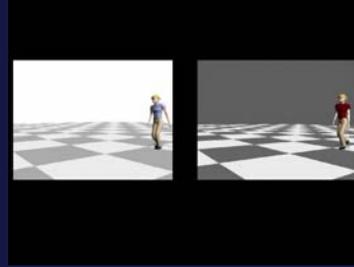
Alla Safonova

## Side-by-side Comparison



Alla Safonova

## Side-by-side Comparison



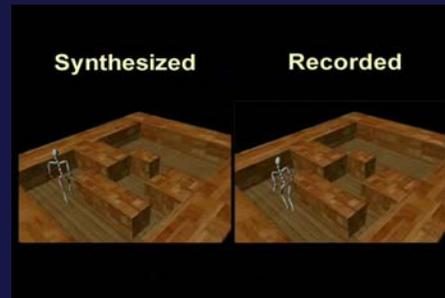
Alla Safonova

## Side-by-side Comparison



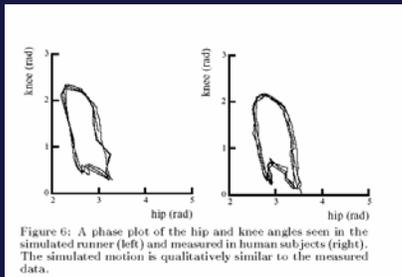
Jehee Lee

## Side-by-side Comparison



Jehee Lee

## Side-by-side Comparison



Or force plate data?

## Perceptual Studies

Which motion is more natural?  
Which motion is wrong?  
Can you detect a change?



Reitsma and Pollard,  
SIGGRAPH 2003



Harrison, Rensink, van de Panne SIGGRAPH 2004

## Perceptual Studies

Hodgins, J. K., O'Brien, J. F., Tumblin, J., *Perception of Human Motion with Different Geometric Models*. IEEE: Transactions on Visualization and Computer Graphics, December 1998, Vol. 4, No. 4, pp. 307-316.

### Hypotheses:

Simple representations → fine distinctions

Complex, "accurate" representations → fine distinctions

Equally fine distinctions independent of model

## Perceptual Studies

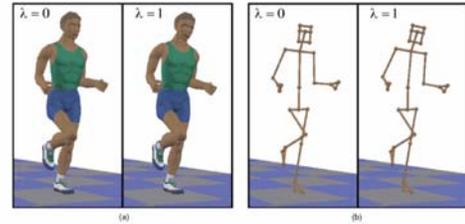


Fig. 1. Images of an animated human runner. (a) Two running motions rendered using a polygonal model. (b) The same pair of motions are rendered with a stick figure model. Modifications to the motion were controlled by a normalized parameter,  $\lambda$ , that varied between  $\lambda = 0$  and  $\lambda = 1$ . These images are from the motion generated for the additive noise test discussed in Section 3.3. The difference in posture created by the additive noise can be seen in the increased angle of the neck and waist in the right image of each pair ( $\lambda = 1$ ).

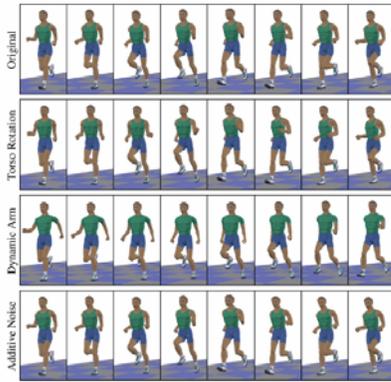


Fig. 3. Examples from the motion sequences rendered with the polygonal model. First Row: Original motion sequence,  $\lambda = 0$ , used in all tests. Second Row: Torso rotation motion sequence with 10x magnification of the torso rotation,  $\lambda = 1$ . Third Row: Dynamic arm motion sequence with maximum exaggeration,  $\lambda = 1$ . Fourth Row: Additive noise motion sequence with sinusoidal noise of  $\pm 0.15$  radians,  $\lambda = 1$ . Images are spaced at intervals of 0.067 seconds.

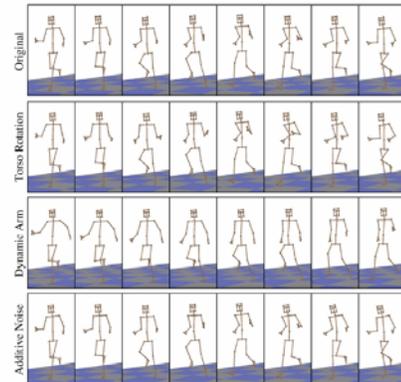


Fig. 4. Examples from the motion sequences rendered with the stick figure model. First Row: Original motion sequence,  $\lambda = 0$ , used in all tests. Second Row: Torso rotation motion sequence with 10x magnification of the torso rotation,  $\lambda = 1$ . Third Row: Dynamic arm motion sequence with maximum exaggeration,  $\lambda = 1$ . Fourth Row: Additive noise motion sequence with sinusoidal noise of  $\pm 0.15$  radians,  $\lambda = 1$ . Images are spaced at intervals of 0.067 seconds.

$\log(\alpha)$ , is defined as

$$\log(\alpha) = \frac{\log(H/(1-H)) - \log(F/(1-F))}{2}, \quad (1)$$

where  $H$  is the fraction of pairs in a set that were *different* and which the subject labeled correctly, and  $F$  is the fraction of pairs in a section that were *the same* and which the subject labeled incorrectly

The sensitivity measure,

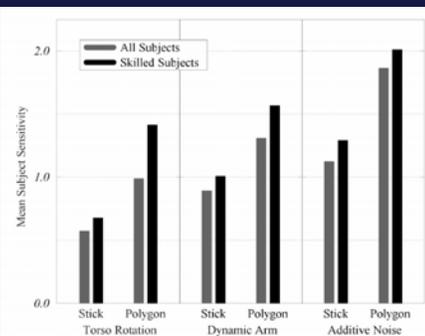


Fig. 8. Sensitivity scores by experiment averaged over subject groups. Skilled subjects are those who achieved a sensitivity score of  $\log(\alpha) \geq 1.0$  on either the polygonal or the stick figure portion of the test. Note that sensitivity scores are consistently higher with the polygonal model.

## Conclusions

Full model allowed finer distinctions for all three of our tests.

Different models allow different distinctions to be made → the graphics community should have standards for results to be compared.

## Strengths? Weakness?

First study that looked at this question.  
Confirmed several times since in similar but different experiments.

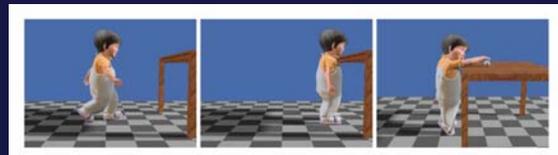
None of the running motions looked natural?  
Did we span the space of variations?  
Only tested two models (both fairly crude)  
Subdivision into skilled and not skilled subjects (post-hoc)

## Follow-on Studies?

Camera motion?  
Clothing, Hair motion?  
Breathing, facial expressions?

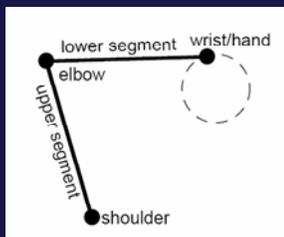
## Perceptual Studies

Jason Harrison, Ron Rensink, and Michiel van de Panne, [Obscuring Length Changes During Animated Motion](#), ACM Transactions on Graphics, 23(3), Proceedings of SIGGRAPH 2004.



## Perceptual Studies

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## Perceptual Studies

Movie

## Conclusions

Numbers showing change in limb length that should not be perceivable:  
3% with full attention  
20% when not the focus of attention  
Sensitivity to growing higher than to shrinking (why?)  
Slower changes are less noticeable  
Changes are less noticeable during fast motions

## Strengths? Weakness?

Distractor task is a good experimental design.  
Explored space where one or both segments changed, fast/slow velocities, duration of change.

Study somewhat distant from real question—if you don't see it on the line drawing does that really mean that you won't see it on the cute little kid?

Is perceivable or not the right question? With the little kid, the question we really care about is whether it looks natural or not?

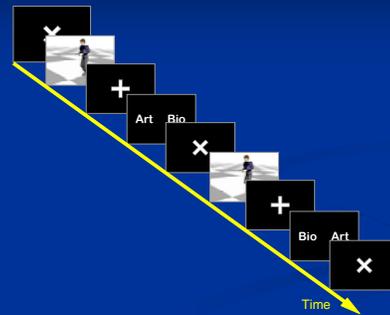
## Follow-on Studies?

Is change in limb length of benefit even if it is noticeable? Makes the kid look like he is trying harder?

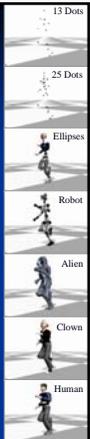
Sub-threshold effects? Higher LOD in soccer players increases rating of skill.

## Response to Model

Experimental paradigm



Collaborators: Thierry Chaminade, Mitsuo Kawato, ATR



## Response to Model

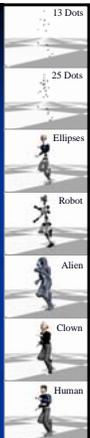
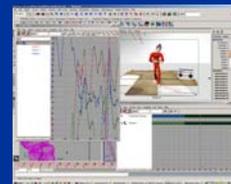


## Response to Model

Motion capture



Keyframed motion



## Behavioral Experiments

### Analysis

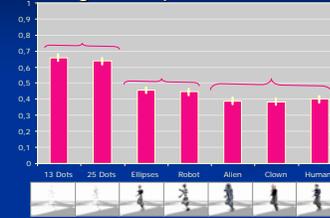
| Subject    | Spec    | Motion capture | Key framed |
|------------|---------|----------------|------------|
| Response   |         |                |            |
| Biological | Correct | Error          |            |
| Artificial | Error   | Correct        |            |

Do models influence perceived naturalness of motion?

→ test effect of model on proportion of **biological responses**.

## Behavioral Experiments

### Results: biological responses



Dot models cause increased biological response rates when compared to others (all pairwise comparison  $p < 0.05$ ).

Ellipses and Robots different from Alien, Clown and Humans (all pairwise comparisons  $p < 0.05$  except Human vs Robot,  $p = 0.11$ );

Within groups comparisons are not significant.

## Experiments

Relationship between the model (rendering style) and the perception of motion. More complex/anthropomorphic models are less likely to be perceived as being biological motion



Reinforces common wisdom in animation community – motion must be fully rendered to be assessed

Now repeating experiments with fMRI. Preliminary results indicate that model has an effect on STS activity

## fMRI

- What is measured?
  - Blood flow to areas of the brain
  - About 2 seconds after event
  - Scan completed every ~2 seconds
- Data processing
  - Align brain scan with “typical” brain
  - Look for differences in activation between regions for various stimuli
  - Running the machine costs \$600/hour
    - few subjects

## fMRI

- Conclusions
  - X area lights up when we show human motion but not when we show similar frequency non-human motion
  - X area has known to be associated with y so it's interesting that it also turns up in our study of z
- A powerful tool or the next phrenology?

## Behavioral Studies

Perceptual experiments tell us what we can perceive—but not necessarily what makes a compelling character.

We really want to know how the audience will respond to a character—maybe behavioral metrics get closer to that?

enactment  
interference  
imitation

## Behavioral Studies—Immersion in VR



Use heart rate, galvanic skin response to measure immersion. Test frame rate, lag, walking vs. flying, and other factors.

[http://www.cs.unc.edu/~eve/walk\\_exp/](http://www.cs.unc.edu/~eve/walk_exp/)

## Method: Use enactment as a metric

Extensively studied behavior

Classic experiment:

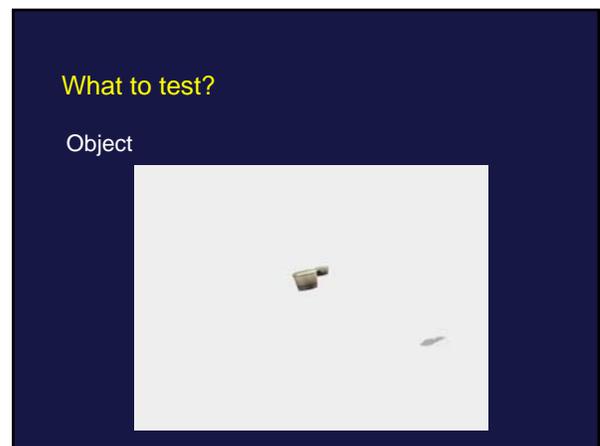
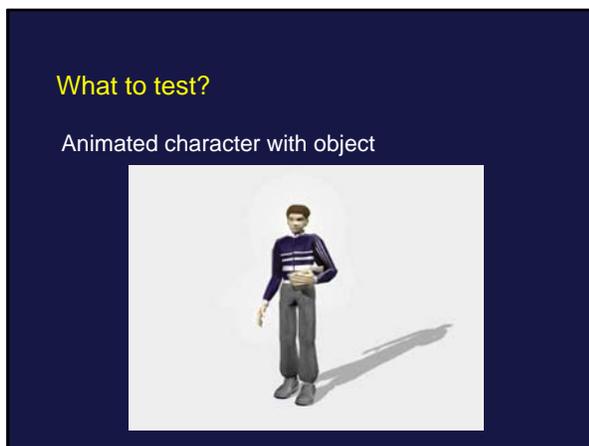
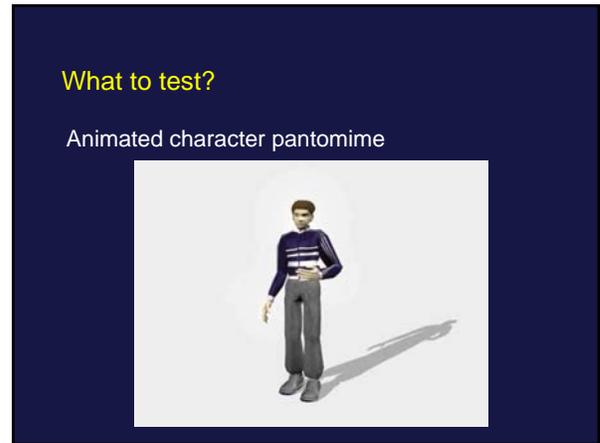
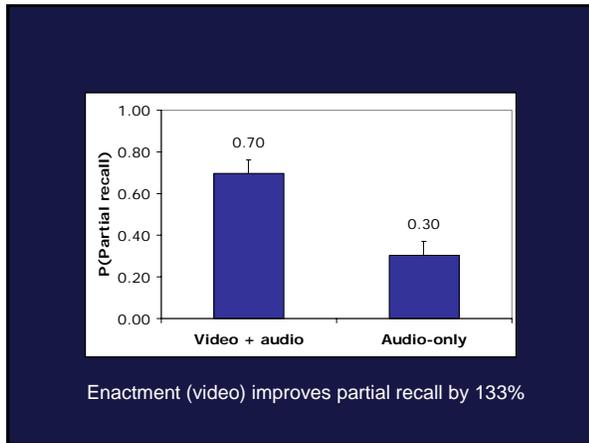
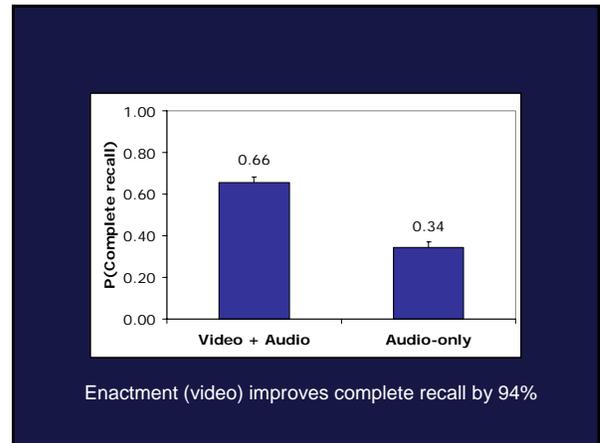
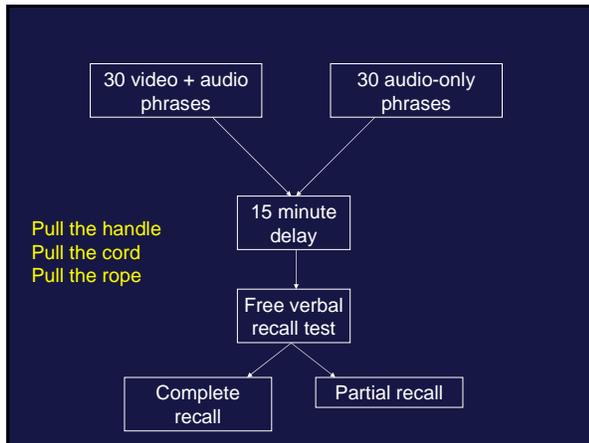
hear, see, or perform ~50 phrases like  
“carry the suitcase”  
delay or distracter task  
tested with recall or recognition  
measure percentage correct and reaction time

|        |              |           |
|--------|--------------|-----------|
| 13%    | 27%          | 46%       |
| Verbal | Experimenter | Subject   |
|        | performed    | performed |

Data from an experiment in the literature

## Method: one verb, multiple objects





### What to test?

Animated character pantomime  
rendering styles  
degraded motion  
different characters



### How might we fail?

Hard to create good animations of these phrases  
Might not be a fine enough discriminator  
Only have n% to work with  
more phrases  
recall rather than old/new  
longer delay

---

Verbal

Experimenter  
performed

Subject  
performed

### What else might work?

Imitation behaviors

- Yawning
- Walking in step

Interference behaviors

- Performing one arm motion while watching another
- Harder for human arm motion
- Not for automation robot?

**Are any of these really measuring what we care about in animated characters?**