

# NTT Visit: *Image Database Retrieval* *Variable Viewpoint Reality*

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## *Overview of Visit*

- Morning: Image Database Retrieval
  - Gatekeeper: Face detection and recognition
  - Complex Feature Image Database Retrieval (Tieu)
  - Flexible Template Retrieval (Yu)
- Interlude
  - Video/Audio Source Separation (Fisher)
  - Mathematical Expression Recognition (Matsakis)
- Lunch
- Visit Prof. Brooks lab

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## *Overview of Visit - 2*

- Afternoon: Variable Viewpoint Reality
  - Real-time 3D reconstruction of people (Snow)
  - Automatic camera calibration (Snow + Lee)
  - Tracking of articulate human models (Lee + Winn)
  - Modeling of human dynamics (Viola + Fisher)

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*Show 3D Soccer software...*

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## *VVR: Motivating Scenario*



- Construct a system that will allow each/every user to observe any viewpoint of a sporting event.
- Provide high level commentary/statistics
  - Analyze plays

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*For example ...*



Computed using a single view...

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some steps by hand

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## *VVR Spectator Environment*

- Build an exciting, fun, high-profile system
  - Sports: Soccer, Hockey, Tennis, Basketball
  - Drama, Dance, Ballet
- Leverage MIT technology in:
  - Vision/Video Analysis
    - Tracking, Calibration, Action Recognition
    - Image/Video Databases
  - Graphics
- Build a system that provides data available nowhere else...
  - Record/Study Human movements and actions
  - Motion Capture / Motion Generation

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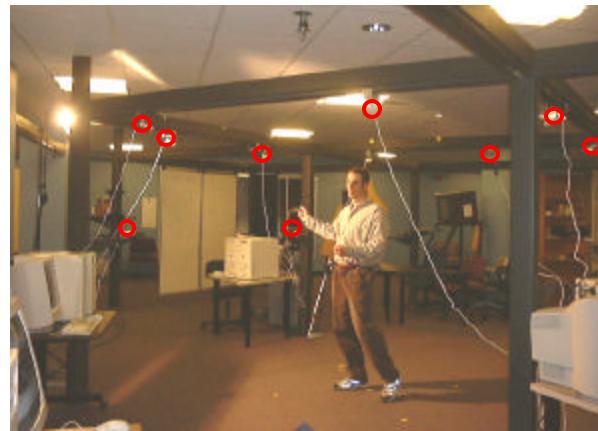
## *Window of Opportunity*

- 20-50 cameras in a stadium
  - Soon there will be many more
- US HDTV is digital
  - Flexible, very high bandwidth digital transmissions
- Future Televisions will be Computers
  - Plenty of extra computation available
  - 3D Graphics hardware will be integrated
- Economics of sports
  - Dollar investments by broadcasters is huge (Billions)
- Computation is getting cheaper

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## *ViewCube: Reconstructing action & movement*

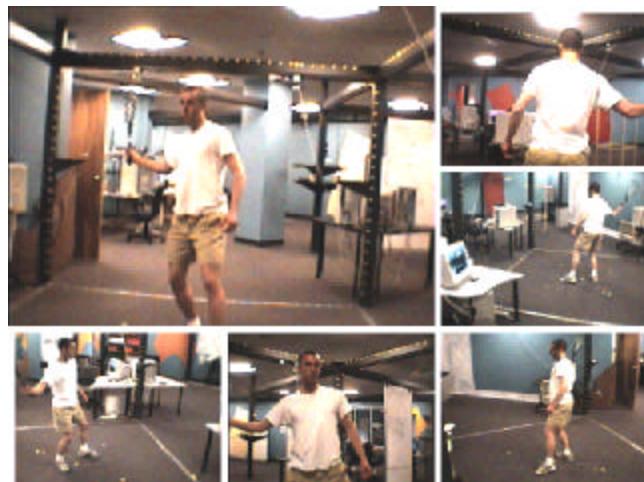


- Twelve cameras, computers, digitizers
- Parallel software for real-time processing

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## *The View from ViewCube*



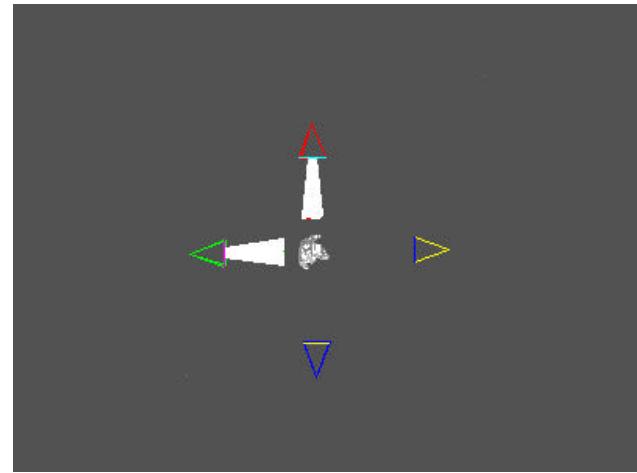
Multi-camera Movie

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## *Projecting Silhouettes to form 3D Models*

Real-time 3D  
Reconstruction  
is computed by  
intersecting  
silhouettes

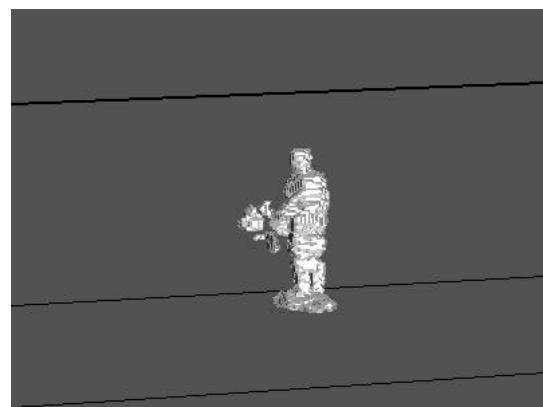


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3D Reconstruction Movie

## *First 3D reconstructions ...*



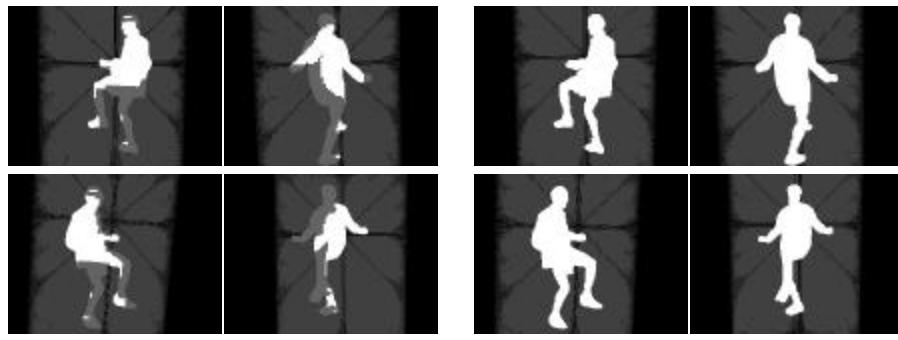
3D Movement  
Reconstruction Movie

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## *Dynamic Calibration*

Calibration is a critical and expensive part of 3D reconstruction  
Our approach is dynamically self-calibrating

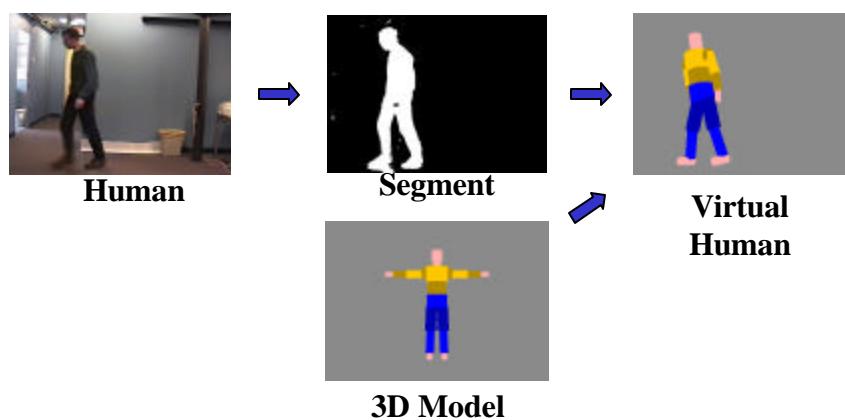


**Initial Calibration**  
- poor reconstruction

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**Automatically Improved**  
Calibration -> better results

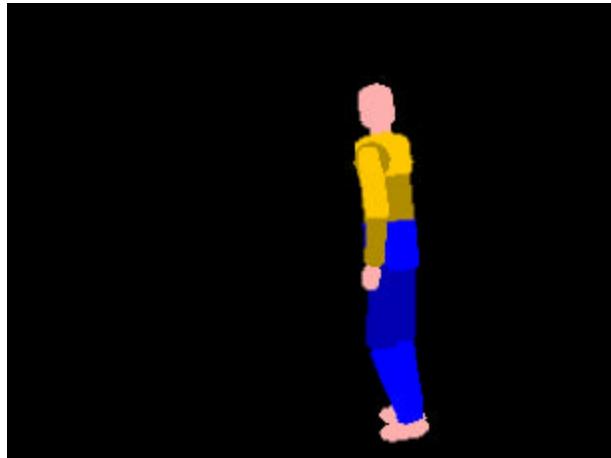
## *Finding an articulate human body*



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*Automatically generated result:*



Body Tracking Movie

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## *Analyzing Human Motion*

- Key Difficulty: Complex Time Trajectories  
Complex Inter-dependencies
- State of the Art: Hidden Markov Models
  - Have a discrete number of states
- Our Approach: Multi-scale statistical models

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*Human Motion is extremely complex:*

Channel

Time

*Human Motion  
is temporal texture  
or  
a temporal signature*



Motion Capture Movie

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*Texture Analysis and Synthesis  
can be applied to Movement Data*



↓ Synthesis



**The texture synthesis tools  
can be applied to movement**

**The texture recognition tools  
can be applied to movement**

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Motion Capture Movie