

## CS448A: Experiments in Motion Capture

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## CS448A: Experiments in Motion Capture

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- Project Course
- Lectures on all key-algorithms
- 3-4 Homeworks (implement key-algorithms)
- Lot's of programming and experimenting!
- Final Group Project
- In-Class presentation of Paper from reading list

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## CS448A: Experiments in Motion Capture

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## Motion Capture - Pipeline

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- Tracking
- Model Fitting/Acquisition
- Kinematics
- Dynamics
- Learning
- Applications

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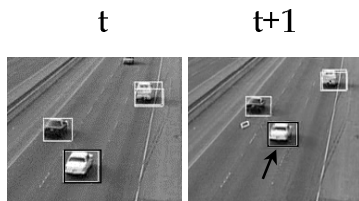
# Visual Tracking

**Visual Tracking:** Unsolved for general settings



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# Visual Tracking



Standard Techniques:

- Template Matching
- Edges / Shape / Color
- Background Subtraction
- Optical Flow

New Challenges:

- Complex Variation
- Self Occlusion
- Noise ( Folds, Low Contrast)

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## Example

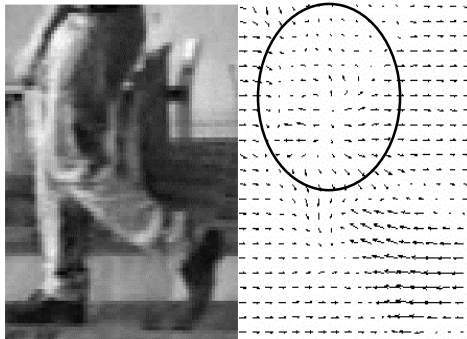
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## Optical Flow

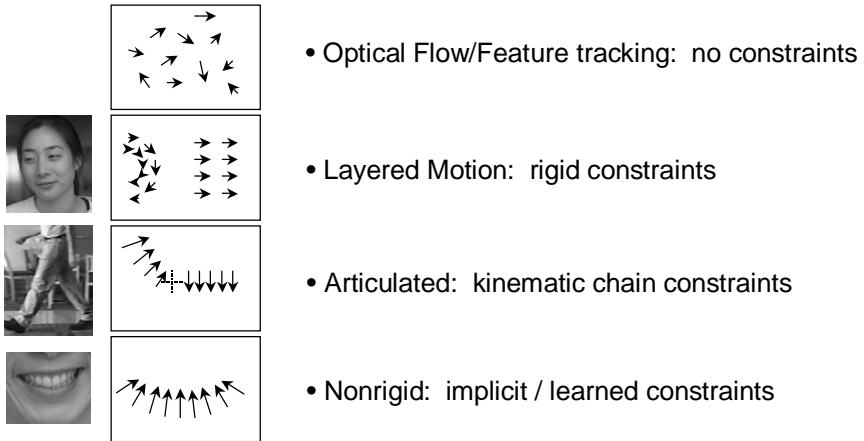
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local  
ambiguities

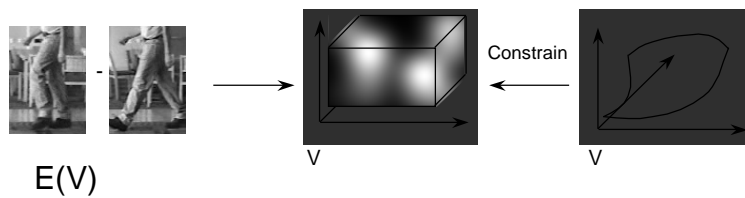
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## Kinematic Model Constraints



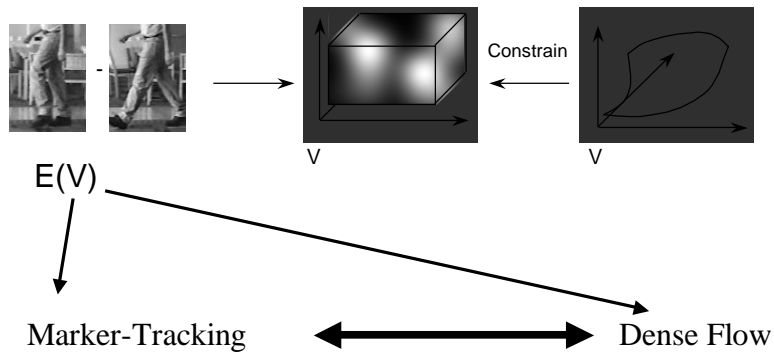
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## Tracking = Constrained Optimization



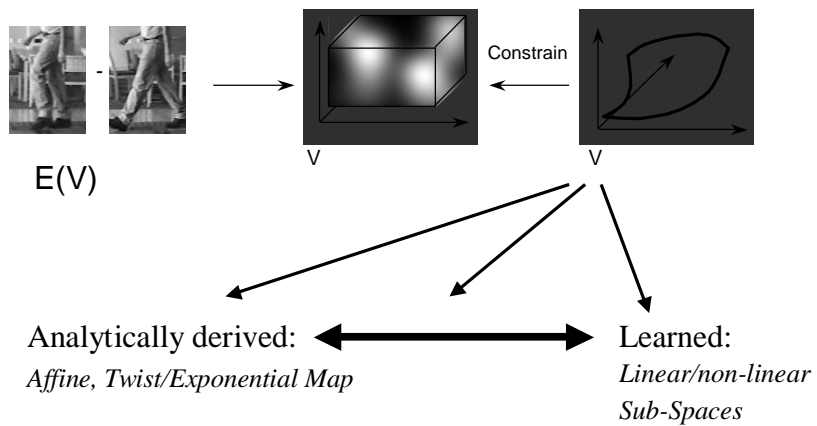
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## Tracking = Constrained Optimization



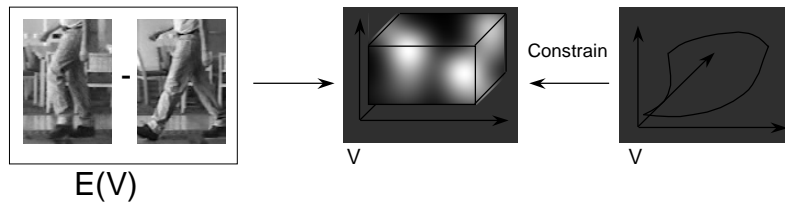
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## Constraints = Subspaces



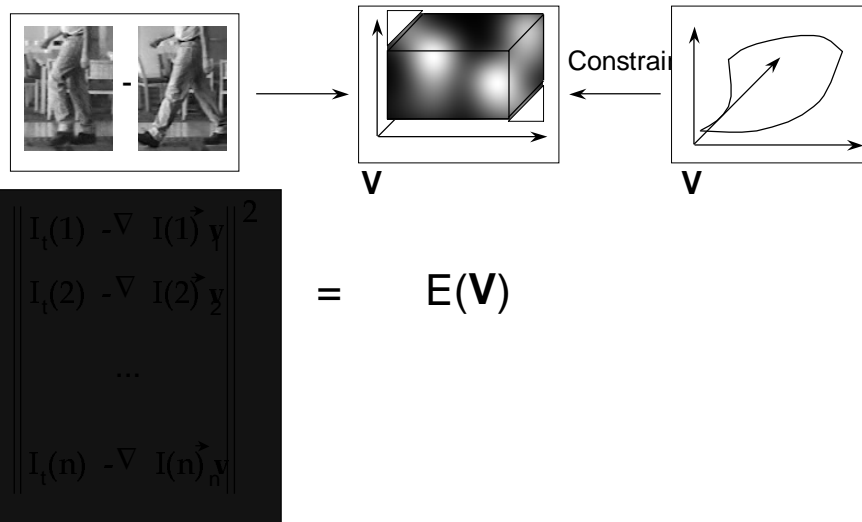
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## Tracking = Constrained Optimization



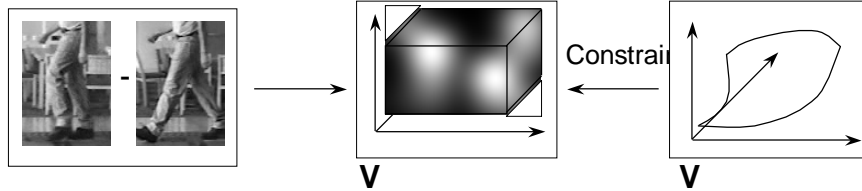
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## Constrained Function Minimization



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## Constrained Function Minimization



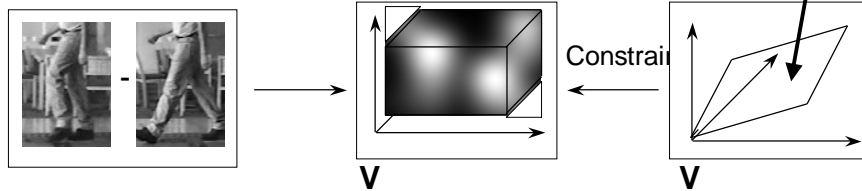
$$\begin{pmatrix} |I_t(1) - \nabla I(1) \cdot \vec{v}|^2 \\ |I_t(2) - \nabla I(2) \cdot \vec{v}|^2 \\ \dots \\ |I_t(n) - \nabla I(n) \cdot \vec{v}|^2 \end{pmatrix}$$

$$= E(\mathbf{V})$$

$$\mathbf{V} = M(\theta)$$

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## 2D Translation: Lucas-Kanade



$$\begin{pmatrix} |I_t(1) - \nabla I(1) \cdot \vec{v}|^2 \\ |I_t(2) - \nabla I(2) \cdot \vec{v}|^2 \\ \dots \\ |I_t(n) - \nabla I(n) \cdot \vec{v}|^2 \end{pmatrix}$$

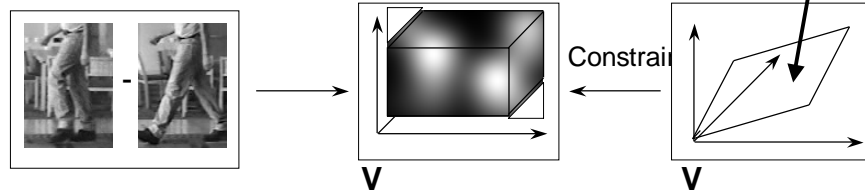
$$= E(\mathbf{V})$$

$$\mathbf{V} = \begin{pmatrix} dx, dy \\ dx, dy \\ \dots \\ dx, dy \end{pmatrix}$$

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## 2D Affine: Bergen et al, Shi-Tomasi



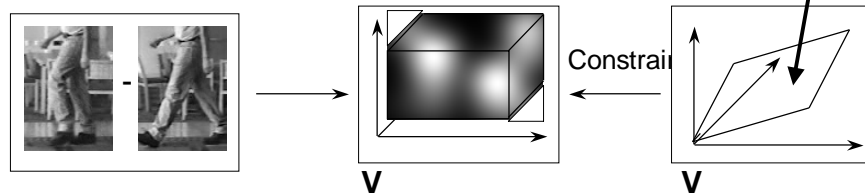
$$\left\| \begin{array}{l} I_t(1) - \nabla I(1) \vec{v} \\ I_t(2) - \nabla I(2) \vec{v} \\ \dots \\ I_t(n) - \nabla I(n) \vec{v} \end{array} \right\|^2$$

$$= E(\mathbf{V})$$

$$\vec{v}_i = \begin{bmatrix} a1, a2 \\ a3, a4 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} dx \\ dy \end{bmatrix}$$

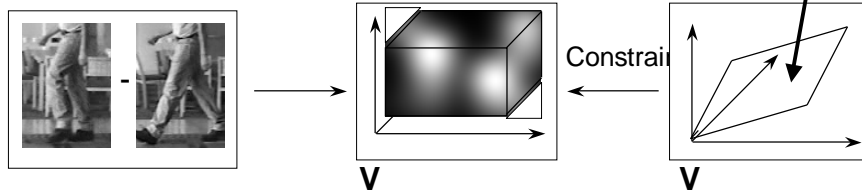
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## 2D Affine: Bergen et al, Shi-Tomasi



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## K-DOF 3D chain: Yamamoto, Bregler-Malik K-DOF



$$\left\| \begin{array}{l} I_t(1) - \nabla I(1) \vec{y} \\ I_t(2) - \nabla I(2) \vec{z} \\ \dots \\ I_t(n) - \nabla I(n) \vec{v}_n \end{array} \right\|^2$$

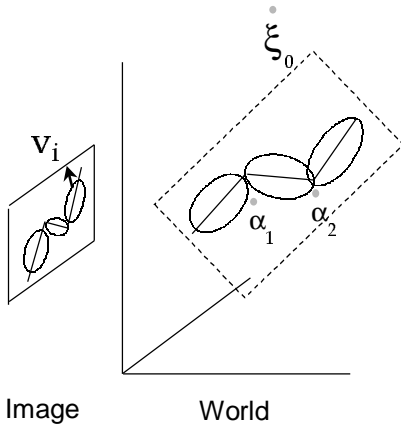
$$= E(\mathbf{V})$$

$$\mathbf{V} = \mathbf{M}(\theta)$$

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## Twist and Product of Exp. Maps

orthographic projection



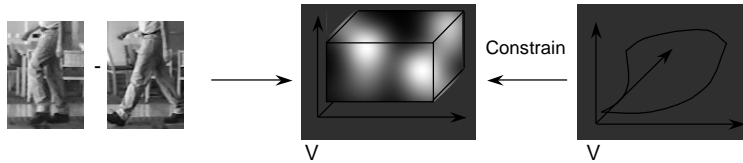
$$p_i = \begin{bmatrix} S & 0 & 0 & 0 \\ 0 & S & 0 & 0 \end{bmatrix} e^{\hat{\xi}_0} e^{\hat{\xi}_1 \alpha_1} e^{\hat{\xi}_2 \alpha_2} q_i$$

$$\downarrow \frac{\delta}{\delta t}$$

$$v_i = M_i \begin{bmatrix} \dot{\xi} \\ \dot{\alpha} \end{bmatrix}$$

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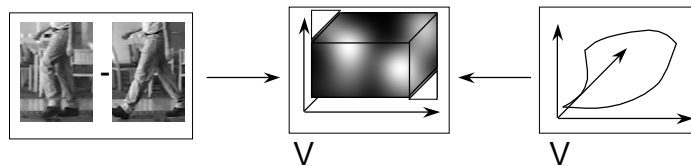
## Analytically derived Constraints



$$\left\| \begin{array}{c} I_t(1) - \nabla I(1) \vec{v}_1 \\ I_t(2) - \nabla I(2) \vec{v}_2 \\ \dots \\ I_t(n) - \nabla I(n) \vec{v}_n \end{array} \right\|^2 = E(V) \quad V = M \begin{bmatrix} \xi \\ \alpha_1 \\ \dots \\ \alpha_K \end{bmatrix}$$

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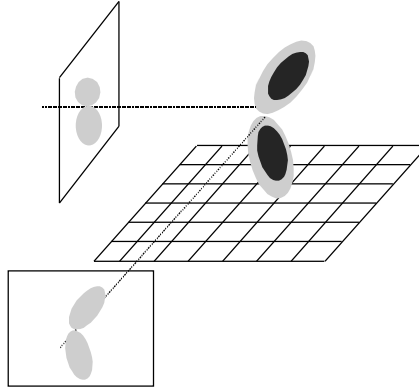
## Example Track



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## Multiple Views

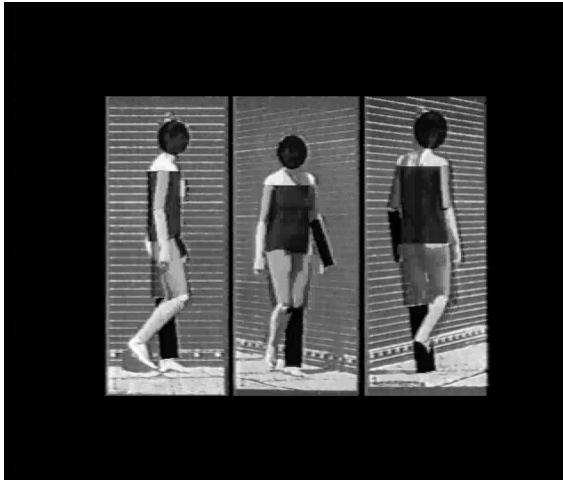
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## Example Track -2-

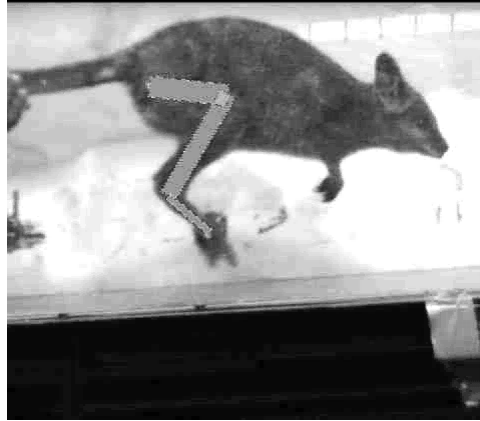
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## Tracking + Acquisition of Kinematics

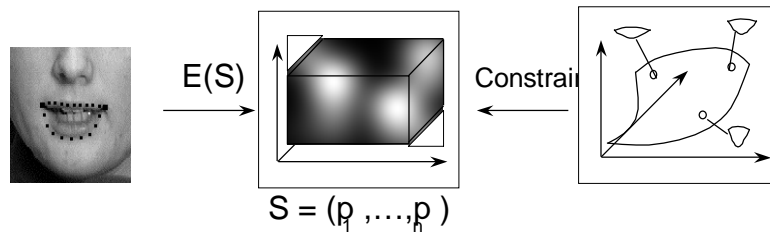
- Acquire Kinematic Chains.



Kathy Pullen

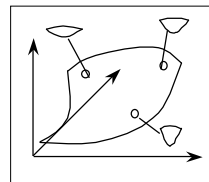
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## Non-Rigid Constrained Spaces



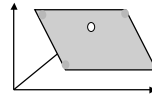
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# Non-Rigid Constrained Spaces

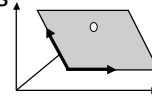


Linear Subspaces:

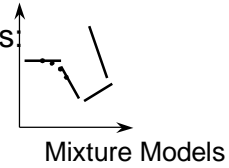
- Small Basis Set



- Principal Components Analysis



Nonlinear Manifolds:

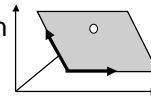


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## Nonrigid Examples



Constrain



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## Nonrigid 3D Acquisition

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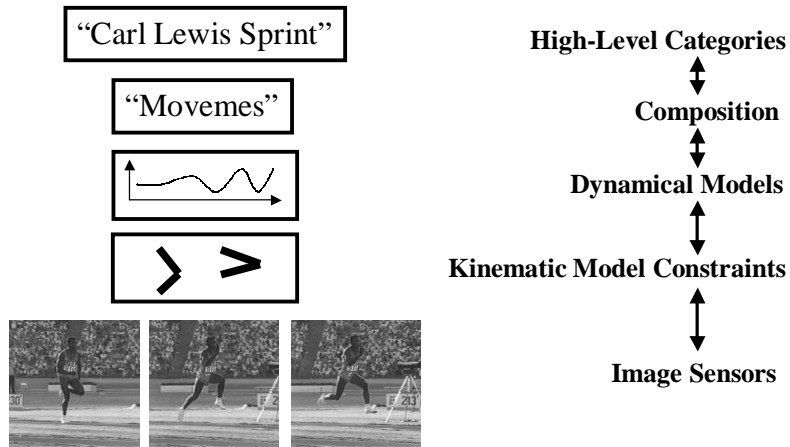
## Human Dynamics

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- Forces applied on masses
- Exploit models from Biomechanics
- Motor control / High-level processes
- Learning Statistical Models of Dynamics
- “Motion-Phonemes”: *Movemes*
- Laban Movement Analysis

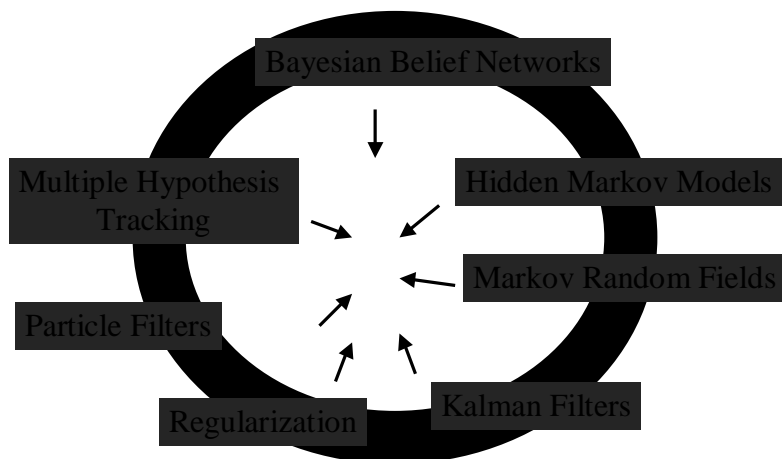
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## Probabilistic Models / Bayesian Techniques



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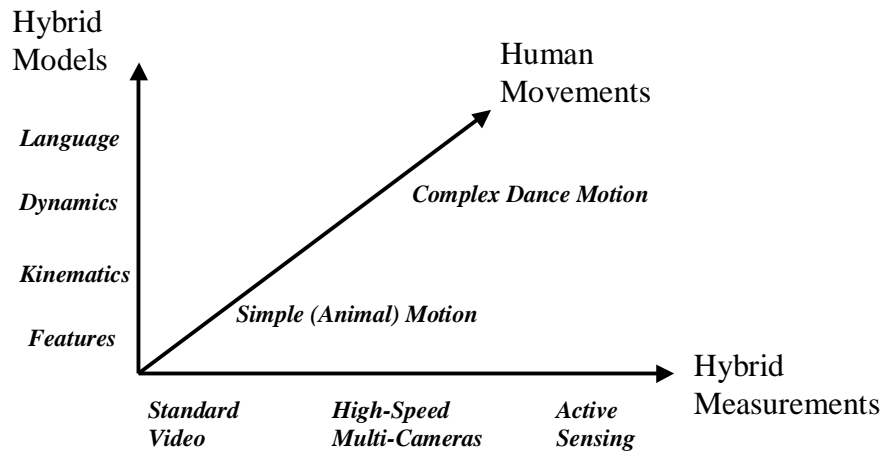
## Probabilistic Models / Bayesian Techniques



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# HM<sup>3</sup>



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## Performance Capture based Animation



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## Rotoscope / Mocap: History

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- Disney:



Step-mother of Cinderella

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## Rotoscope / Mocap: History

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- Disney:



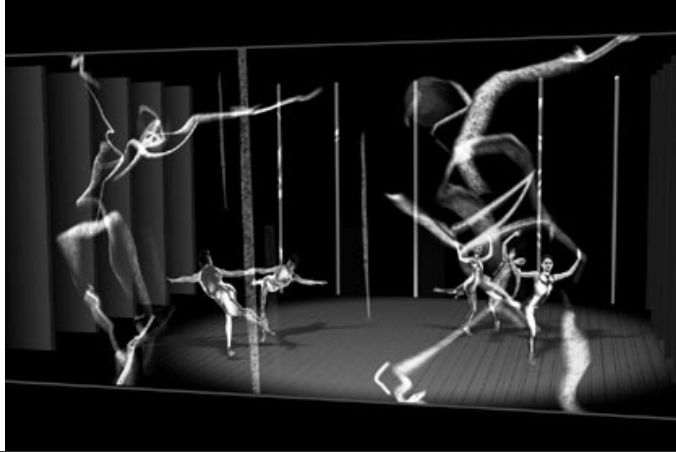
Eleanor Audley

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## Rotoscope / Mocap: History

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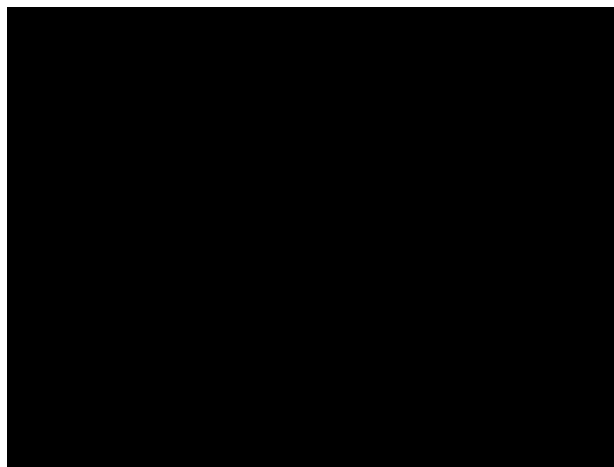
- Rebecca Allen / Twyla Tharp: The Catherine Wheel
- Paul Kaiser / Merce Cunningham: → “Biped”



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## Performance Capture based Animation

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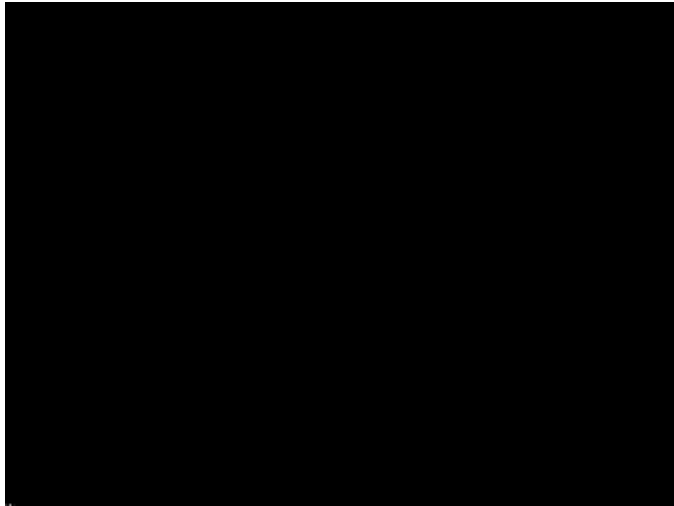


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## Performance Capture based Animation

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## Performance Capture based Animation

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-> Popovic Files

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## **CS448A: Homeworks**

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- 3 Homeworks on Tracking: Lucas-Kanade, Extensions, Kalman
- 1 Homework on Camera Calibration
- [ 1 Homework on Model Acquisition/Fitting ]

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## **CS448A: Paper Presentation**

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- Presentation for 20 min (depending on class size)
- Choose from Reading List
- or – find it yourself

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## **CS448A: Project**

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- Start thinking about it now
- In-class brainstorming session
- Proposal with 2 Milestones
- Group work

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## **CS448A: Project Ideas**

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- Full-Body Tracker:
  - Offline / Real-time
  - Resolution: 3D Blob, Kinematic Model
- Hand Tracker:
  - 2D vs 3D / how many cameras
  - Features: Color, Silhouette, Flow, Regions, Edges
  - Explicit kinematic model vs learned PCA model
- Face Tracker:
  - Markers / no Markers
  - same issues as above

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## **CS448A: Project Ideas**

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- Generic 3D Model Acquisition based on Marker tracking
- Kinematic model fine-tuning
- Pan-Tilt tracker
  - Integrate with 3D blob tracker or other
  - Angle, Zoom, Focus, ....
- Gesture Recognition
  - HCI applications -> iRoom
- Application of Mocap to Animation
  - Full Body / Face
- ...

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## **CS448A: How to get in**

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- email to: [cs448a-staff@cs](mailto:cs448a-staff@cs)
  - Your name, email, website
  - Probability of taking this class
  - Your background (Classes, childhood, etc...)
  - What you would like to do for a project
- website: [graphics/courses/cs448a](http://graphics/courses/cs448a)

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