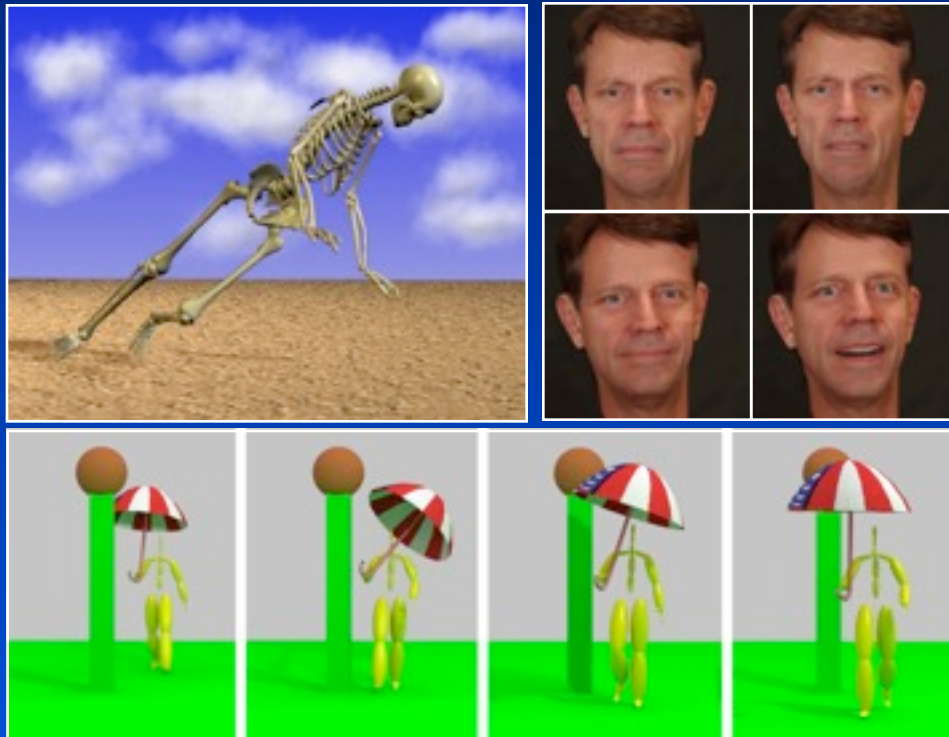
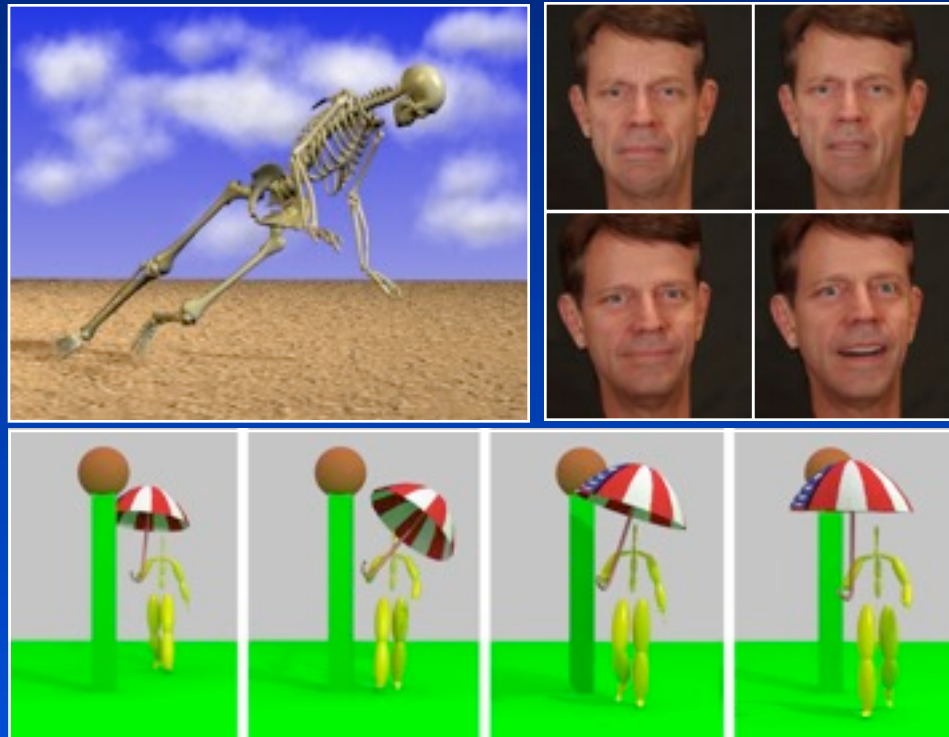


# Virtual Characters for Computer Games



**Petros Faloutsos**  
[www.cse.yorku.ca/~pfal](http://www.cse.yorku.ca/~pfal)

# Virtual Characters for Computer Games



...and why I should learn Java, inheritance and all those things

# Who am I?

---

New faculty member in digital media

[pfal@cse.yorku.ca](mailto:pfal@cse.yorku.ca)

[www.cse.yorku.ca/~pfal](http://www.cse.yorku.ca/~pfal)

# Main Research Directions

## *Human Animation*

- Motion control
- Facial animation
- Autonomous virtual humans
- Sensing, Interaction with the Environment

## *Micro-architectures for Interactive Applications*

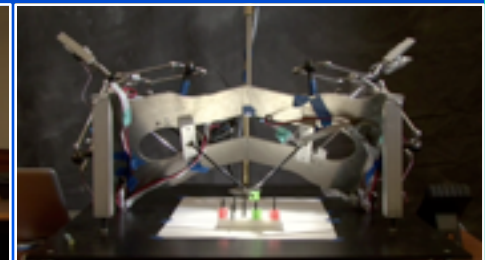
- Real-time rendering
- Real-time physics
- Real-time artificial intelligence

## *Human Computer Interaction*

- Assistive Devices
- Novel interfaces

## *Digital Media In Medicine*

- Automatic Assessment of Surgical Skills
- Telementoring - UCLA Laparobot
- Surgical Assistants





# Take home message

***Everything you learn can help with/lead to exciting careers***

- R&D for special effects studio
- Technical Director for a special effects studio
- Computer Games Programmer
- Software Engineer

***I will show you what past u/graduate students have done that lead to great positions***

# But first some history and basics

---

# Computer Graphics

***Pictures!***  
***Motion!***

**Art**

*Images copyrighted by  
PIXAR and Disney*

**Mathematics**

**Vision**

**Optics**

**Biomechanics**

**Physics**

**Engineering**

**Artificial  
Intelligence**



**Programming!**

# Movies

*To reality and beyond !*



# Movies

## *Special Effects*





# Movies

## *Compositing*



# Cartoons





# Games

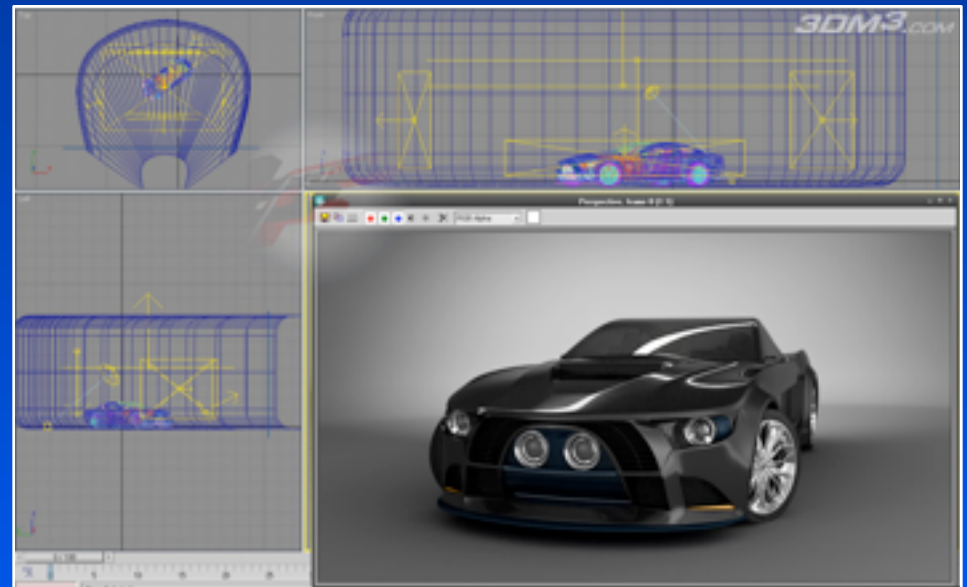
*Focus on interactivity*



# Computer-Aided Design

*Precision modeling*

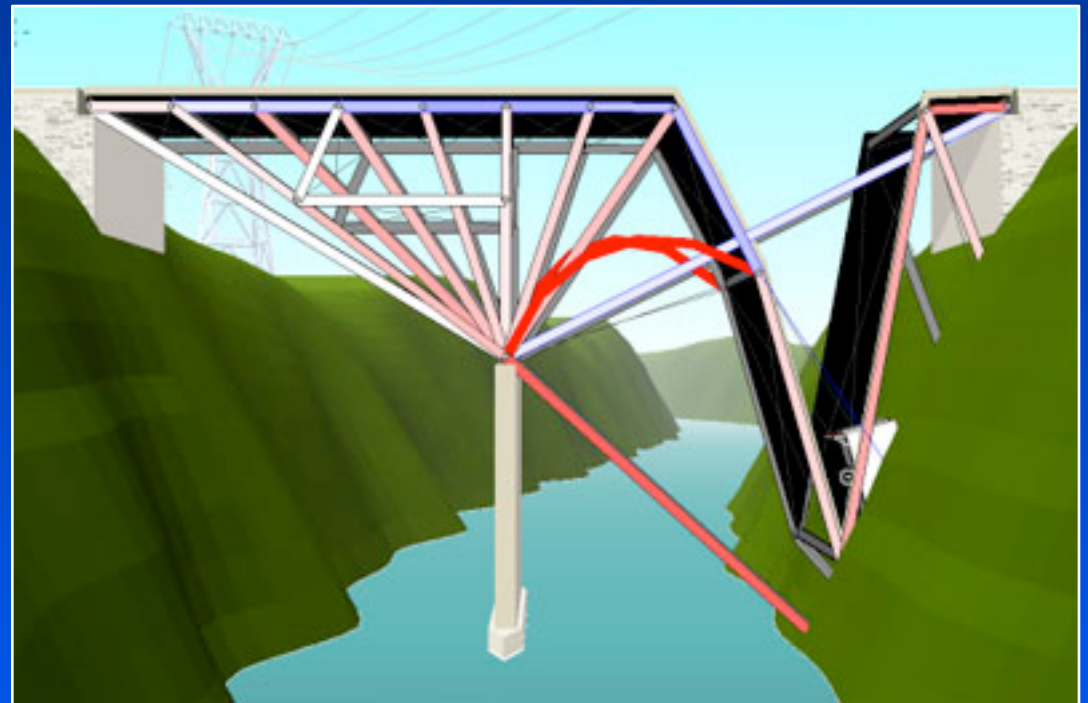
*Engineering visualization*



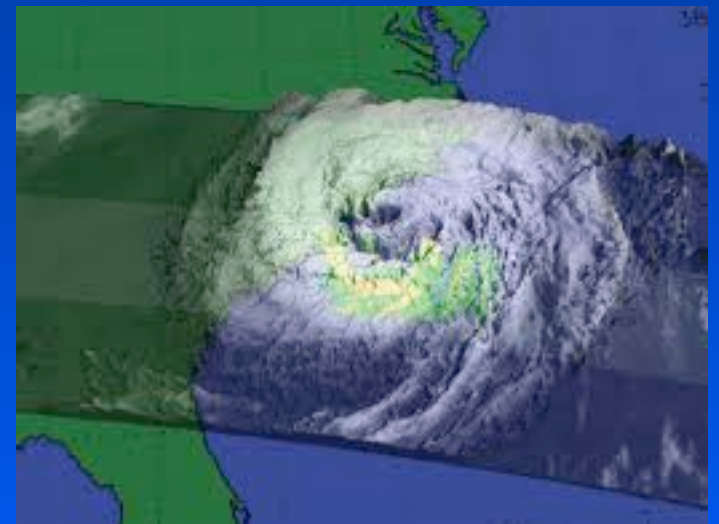
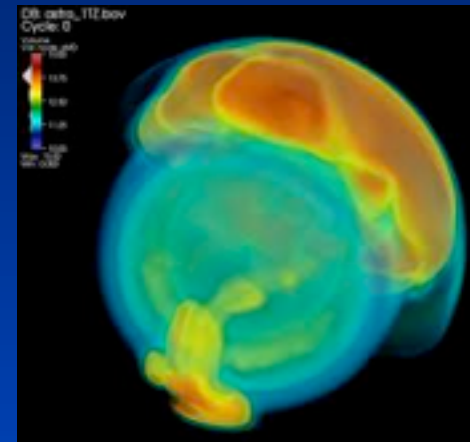
# Computer Aided Design

*It is not just about visualization*

- Simulation is useful



# Visualization: Scientific



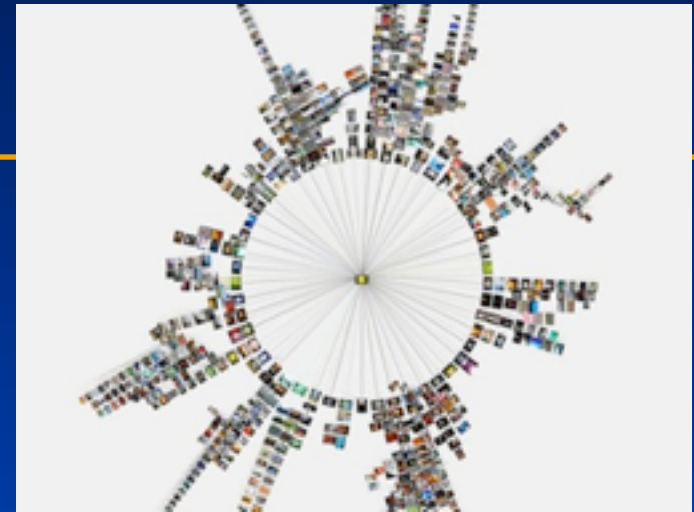


# Visualization: Architectural

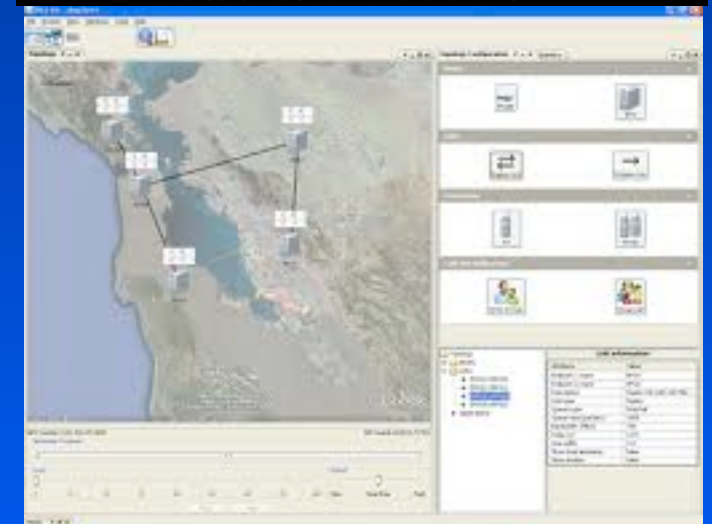
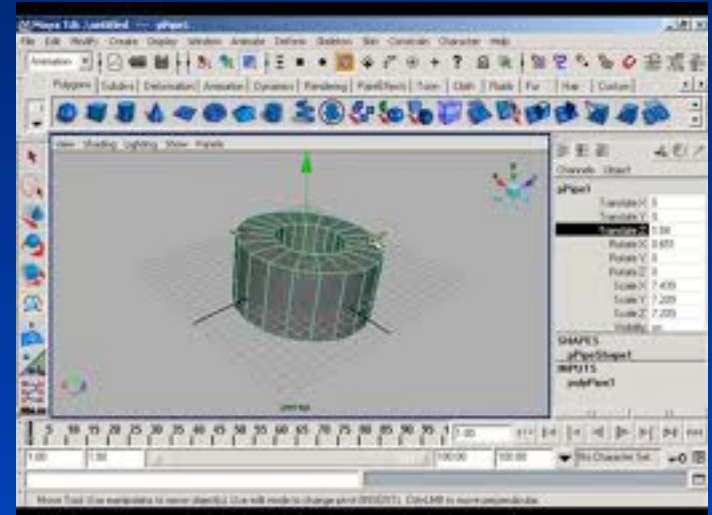


# Visualization: info

- Geographical Information systems
  - Maps
- Personal Information
- Massive dataset visualization

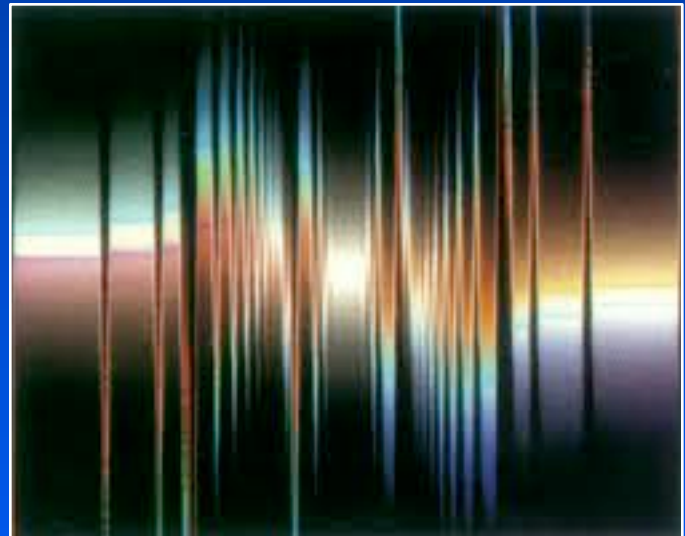
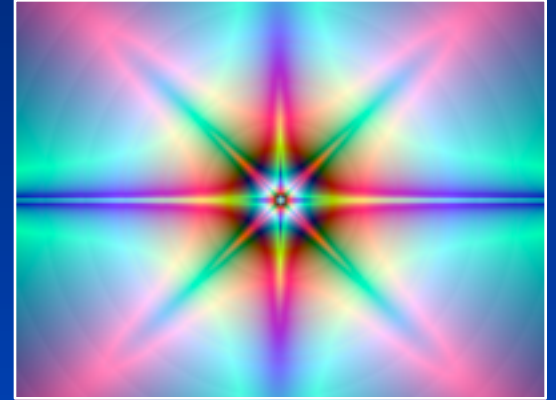


# Graphical User Interfaces





# Digital Art



# Why do we need to program?

## *Things constantly change*

- Evolving hardware (e.g. multi-core)
- Evolving software (e.g. new languages, new structures)
- New techniques

## *User requirements*

- Adjustment specific to application
- Adjustment to director's demands

## *Complexity*

- Massive pieces of software
- Maintenance



# Basic Technical Elements

- Modeling
  - *How do we model (mathematically represent) objects?*
  - *How do we construct models of specific objects?*
- Animation
  - *How do we represent the motion of objects?*
  - *How do we give animators control of the motion?*
- Rendering
  - *How do we simulate the real-world behaviors of light?*
- Interaction
  - *How do we enable humans and computers to interact?*
  - *How do we design human-computer interfaces?*

# Modeling

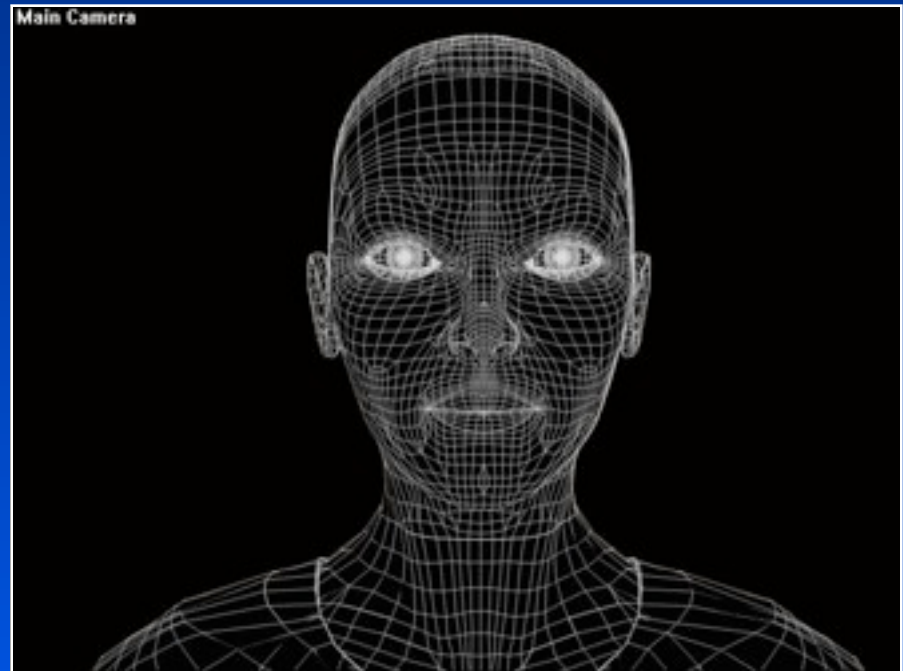
## *Primitives*

- 3D points
- 3D lines and curves
- surfaces (BREPs): polygons, patches
- volumetric representations
- image-based representations

## *Attributes*

- Color, texture maps
- Lighting properties

## *Geometric transformations*



# Rendering

## *Visibility*

### *Simulating light propagation*

- Reflection
- Absorption
- Scattering
- Emission
- Interference



# Animation

---

*Keyframe, motion  
capture*

*Physics-based  
animation*

*Autonomous motion  
planning*



# Animation

---

*Keyframe, motion capture*

*Physics-based animation*

*Autonomous motion planning*

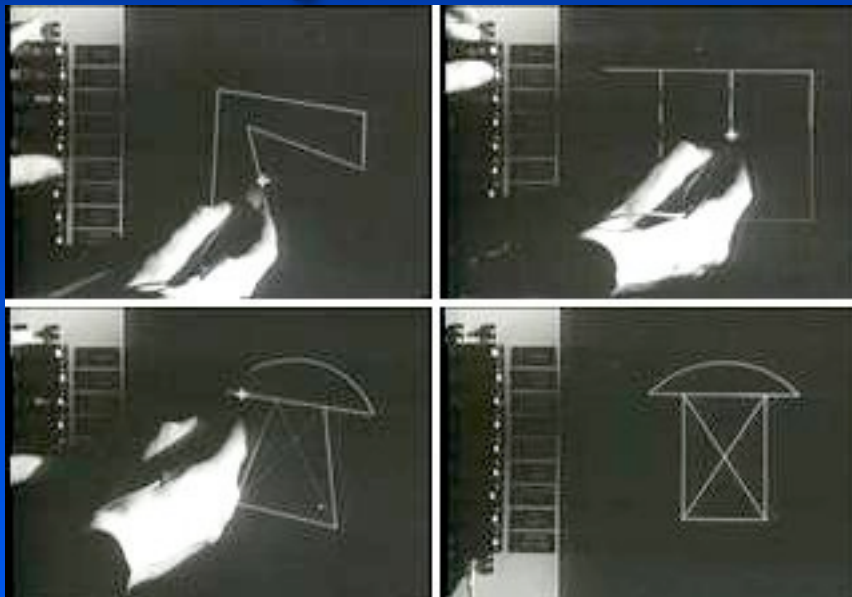




# Genesis of Computer Graphics and Interactive Techniques

## *A PhD project at MIT in the early 1960s*

- Ivan E. Sutherland, 1963
  - *“Sketchpad, a man-machine graphical communication system”*



# Quiz

---

# Quiz

---

<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

# Quiz

---

<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

- When was the term Computer Graphics first stated?

# Quiz

<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

- When was the term Computer Graphics first stated?
  - William Fetter of Boeing coins the term "computer graphics" for his human factors cockpit drawings 1960.*

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<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

- When was the term Computer Graphics first stated?
  - William Fetter of Boeing coins the term "computer graphics" for his human factors cockpit drawings 1960.*
- When was the GUI developed?

# Quiz

<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

- When was the term Computer Graphics first stated?
  - William Fetter of Boeing coins the term "computer graphics" for his human factors cockpit drawings 1960.*
- When was the GUI developed?
  - GUI developed by Xerox (Alan Kay) 1969*



# Quiz

<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

- When was the term Computer Graphics first stated?
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  - GUI developed by Xerox (Alan Kay) 1969*
- When was Tron released?

# Quiz

<http://www.accad.ohio-state.edu/~waynec/history/timeline.html>

- When was the term Computer Graphics first stated?
  - *William Fetter of Boeing coins the term "computer graphics" for his human factors cockpit drawings 1960.*
- When was the GUI developed?
  - *GUI developed by Xerox (Alan Kay) 1969*
- When was Tron released?
  - *Disney contracts Abel, III, MAGI and DE for computer graphics for the movie Tron released in 1981.*

# Quiz (contd)

---

## Quiz (contd)

---

- Which is the first animated movie to employ CG?

## Quiz (contd)

---

- Which is the first animated movie to employ CG?
  - *The Great Mouse Detective was the first animated film to be aided by CG.*

## Quiz (contd)

---

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- When was DOOM released ?

## Quiz (contd)

- Which is the first animated movie to employ CG?
  - *The Great Mouse Detective was the first animated film to be aided by CG.*
- When was DOOM released ?
  - 1993.

## Quiz (contd)

- Which is the first animated movie to employ CG?
  - *The Great Mouse Detective was the first animated film to be aided by CG.*
- When was DOOM released ?
  - 1993.
- Which was the first totally computer generated movie?



## Quiz (contd)

- Which is the first animated movie to employ CG?
  - *The Great Mouse Detective was the first animated film to be aided by CG.*
- When was DOOM released ?
  - 1993.
- Which was the first totally computer generated movie?
  - *Toy Story 1995*

# Quiz (contd)

---

## Quiz (contd)

---

- Which is bigger in gross revenue, the Gaming Industry or Hollywood?

## Quiz (contd)

---

- Which is bigger in gross revenue, the Gaming Industry or Hollywood?
  - *The Gaming Industry.*

## Quiz (contd)

---

- Which is bigger in gross revenue, the Gaming Industry or Hollywood?
  - *The Gaming Industry.*
- Which is the best selling game of all time?

## Quiz (contd)

- Which is bigger in gross revenue, the Gaming Industry or Hollywood?
  - *The Gaming Industry.*
- Which is the best selling game of all time?
  - *Mario (\$193M), Pokemon(\$155), Final Fantasy (\$68M), The Sims (\$100)*

# First computer game?

---

# First computer game?





# First computer game?

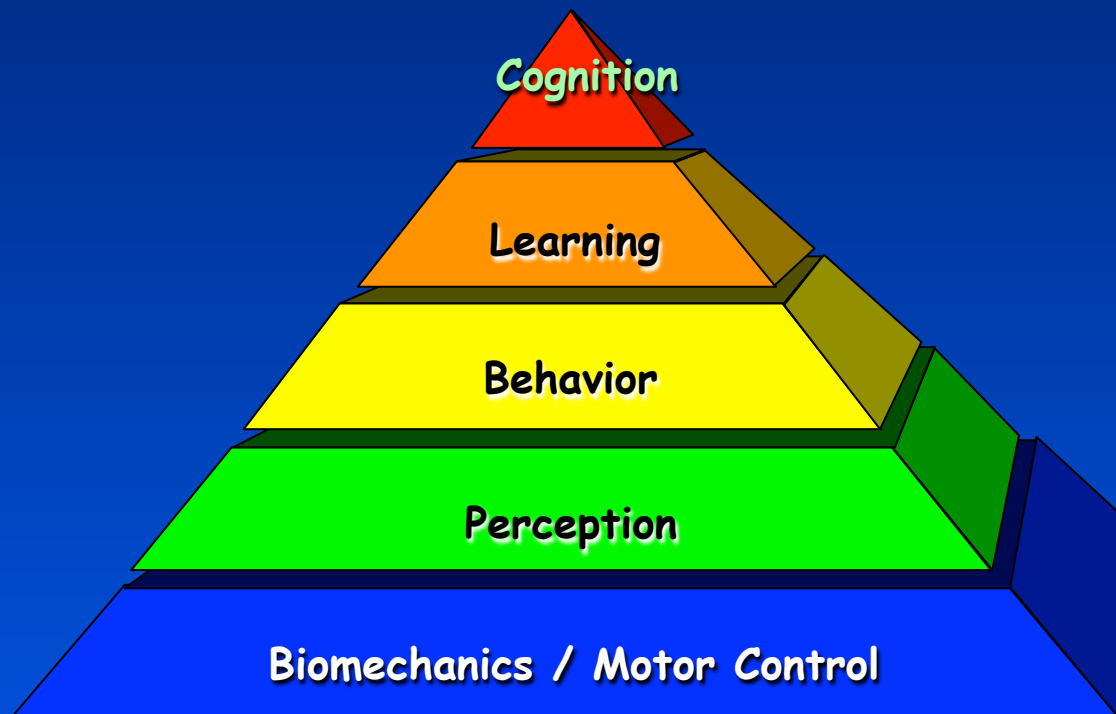
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# First computer game?

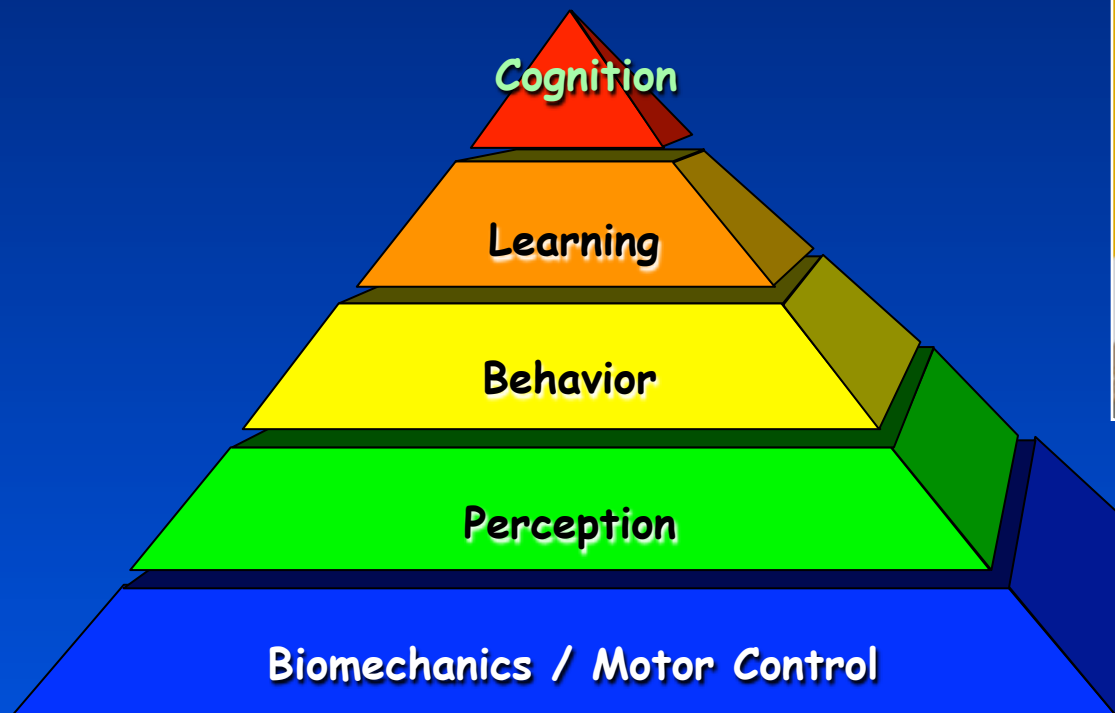


**Spacewars PDP-1 MIT, 1961**

# Intelligent Virtual Characters



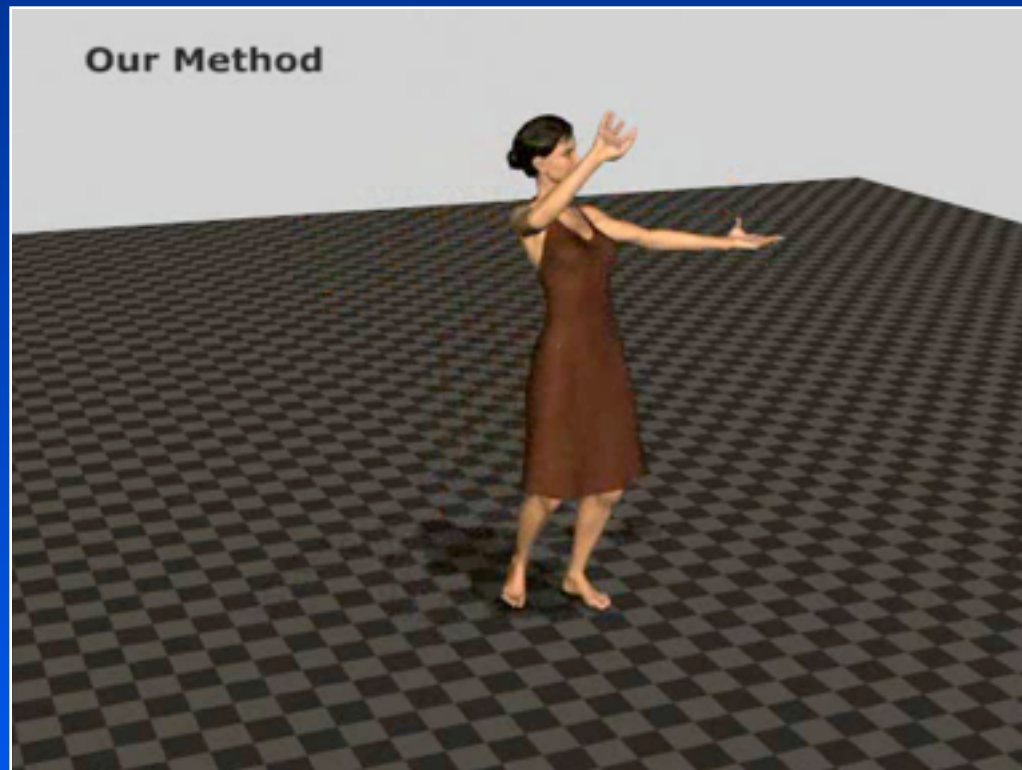
# Intelligent Virtual Characters



# Secondary issues

## *Skinning*

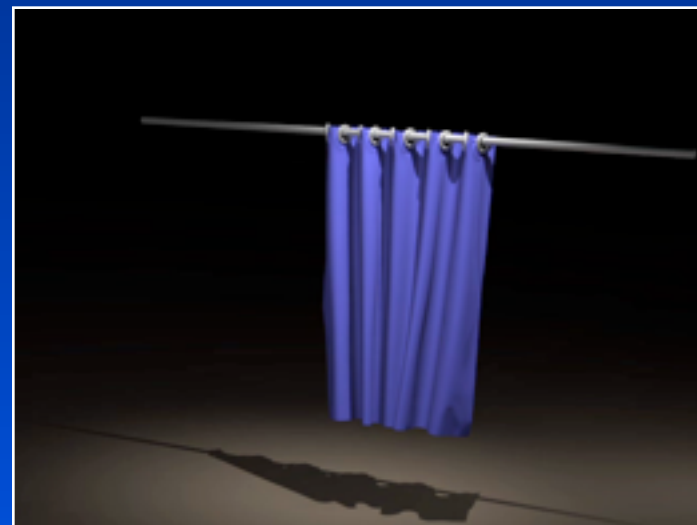
- From skeletons, to fully fleshed models



# Secondary issues

## *Secondary Motions*

- Cloth, hair, soft tissue motion, breathing



Courtesy of Eftychios Sifakis



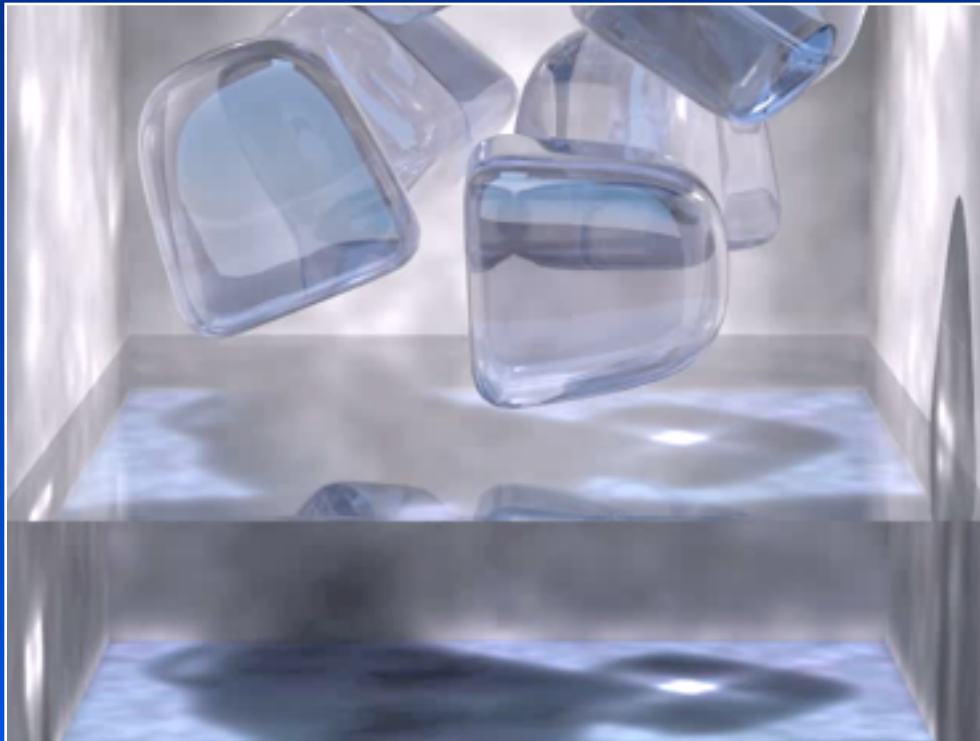
# Secondary issues

## *Rendering*

- Skin, wrinkles, sweat, blushing etc



# Environment



Courtesy of Fedkiew's group

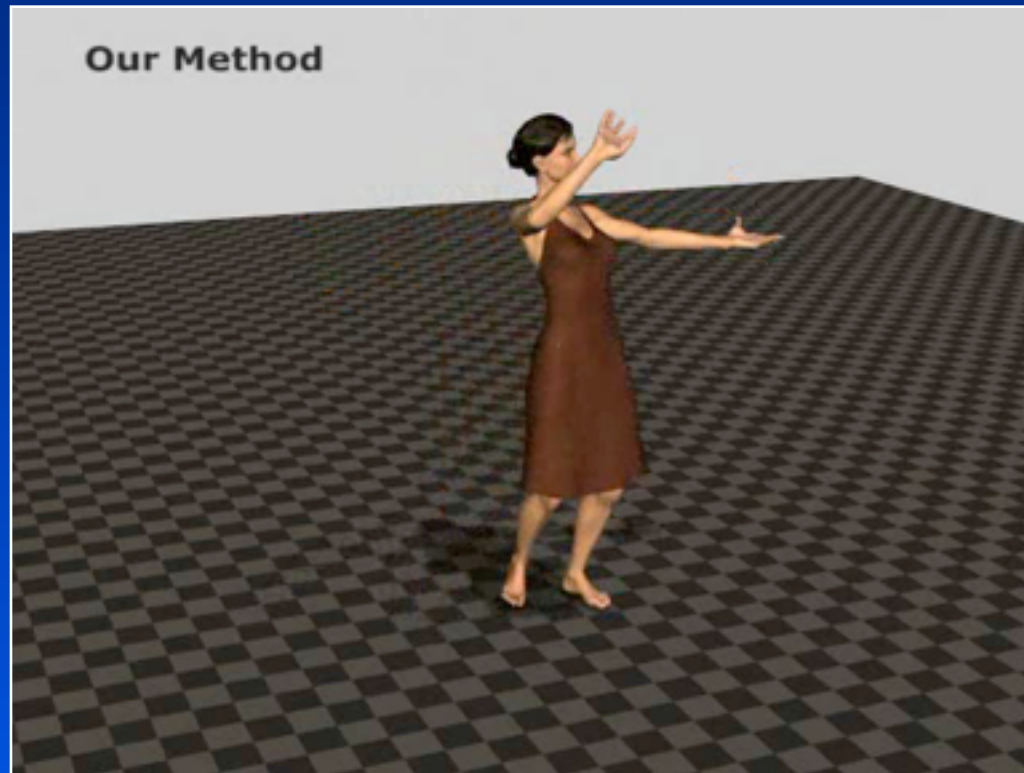
# Sound rendering

---

...

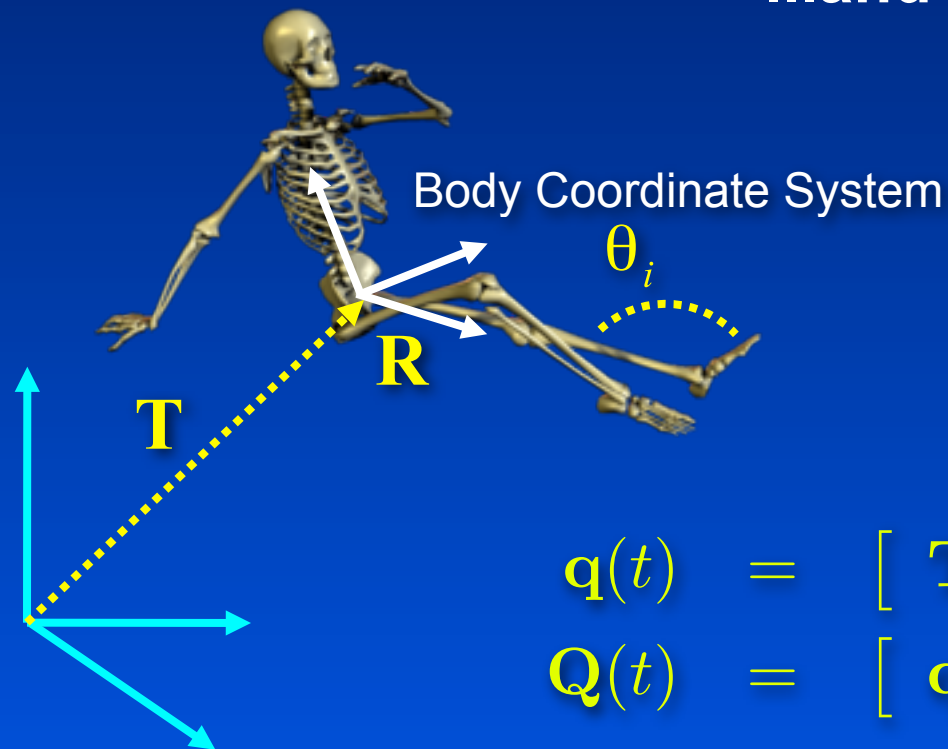
# Motion Synthesis for Virtual Characters

36



# Modeling: Virtual Character

...and why we love math!



$$\mathbf{q}(t) = \left[ \mathbf{T}(t) \quad \mathbf{R}(t) \quad \theta_1 \quad \cdots \quad \theta_n \right]$$

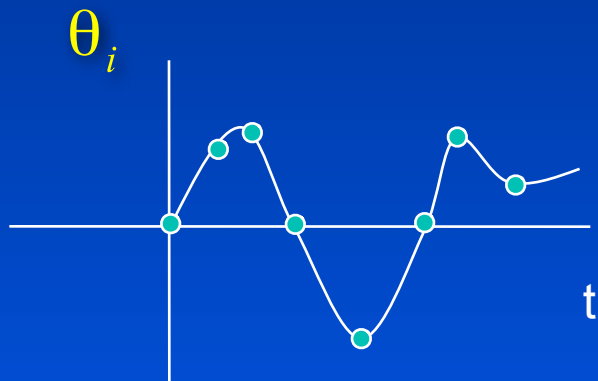
$$\mathbf{Q}(t) = \left[ \mathbf{q}(t) \quad \dot{\mathbf{q}}(t) \right]$$

World Coordinate System

# Motion Synthesis: By hand?

## *Classic Kinematic Approach*

- Keyframes interpolation

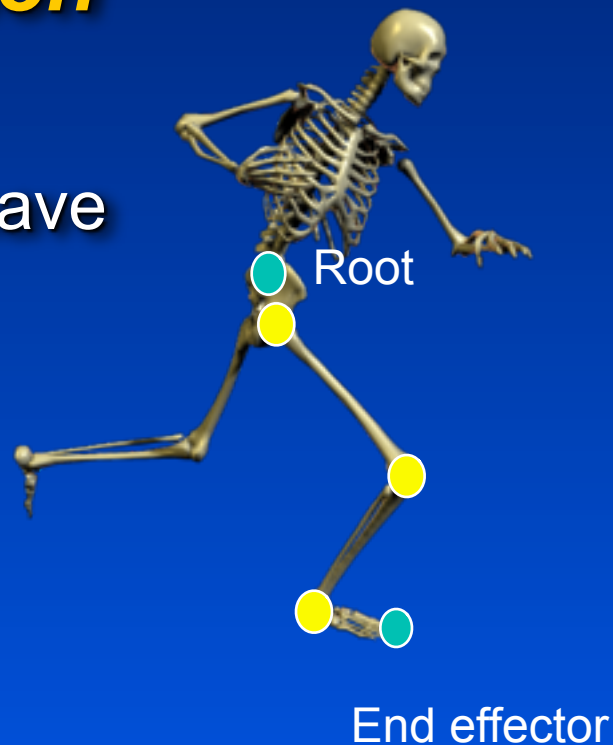




# More automation: Inverse kinematics

## *Constrained optimization*

- Least squares
- $X = f(q)$  we would like to have  
 $q = f^{-1}(X)$



# By example: Motion Capture

*Record live action → Apply on virtual character*

- DOFs  $q(t) = f(\text{markers}(t))$

*Why not motion capture everything?*



# By example: Motion Capture

*Record live action → Apply on virtual character*

- DOFs  $q(t) = f(\text{markers}(t))$

*Why not motion capture everything?*

## *Problems*

- Large databases required
- Applying motions to different characters and environments is tricky
- Interaction

# Editing Mocap: Motion Planning

[with Ari Shapiro and Marcelo Kallmann, UC Merced][I3D07]

***Given a moving character, compute collision-free motions for the limbs***

- Moving obstacles
- Moving target

Original

## ***Key ideas***

- Randomized planner (RRT)
- Include time in the search space
- Efficient configuration sampling

Automatically  
Corrected

## ***Applications***

- Motion Correction
- Grasping motions

# Editing Mocap: Motion Planning

[with Ari Shapiro and Marcelo Kallmann, UC Merced][I3D07]

**Given a moving character, compute collision-free motions for the limbs**

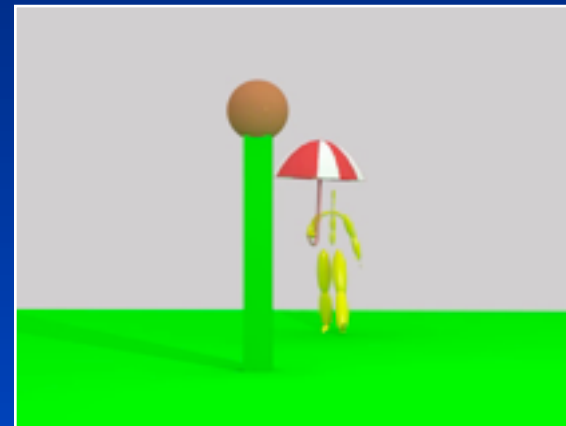
- Moving obstacles
- Moving target

## Key ideas

- Randomized planner (RRT)
- Include time in the search space
- Efficient configuration sampling

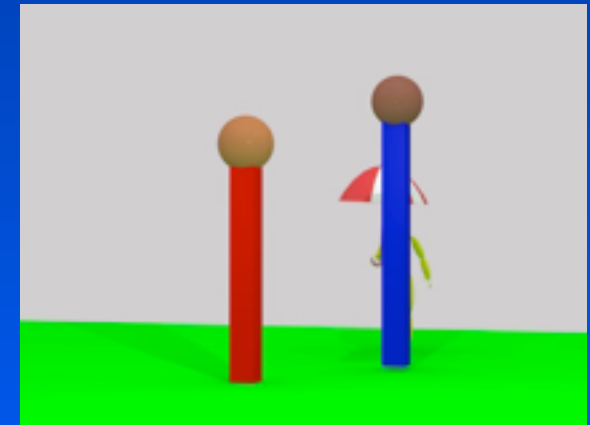
## Applications

- Motion Correction
- Grasping motions



Original

Automatically Corrected



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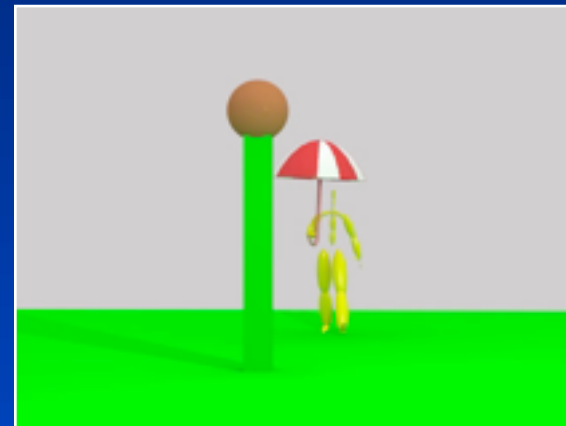
- Moving obstacles
- Moving target

## **Key ideas**

- Randomized planner (RRT)
- Include time in the search space
- Efficient configuration sampling

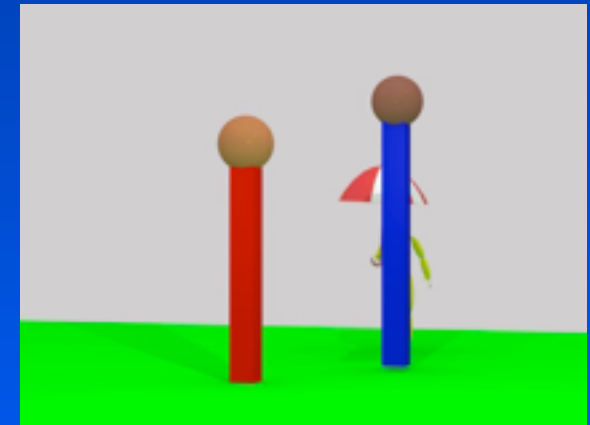
## **Applications**

- Motion Correction
- Grasping motions



Original

Automatically Corrected



# Stealing a hat

---

Original motions

A) Hat set as a “pick up” target

B) Hat is released on “head” target

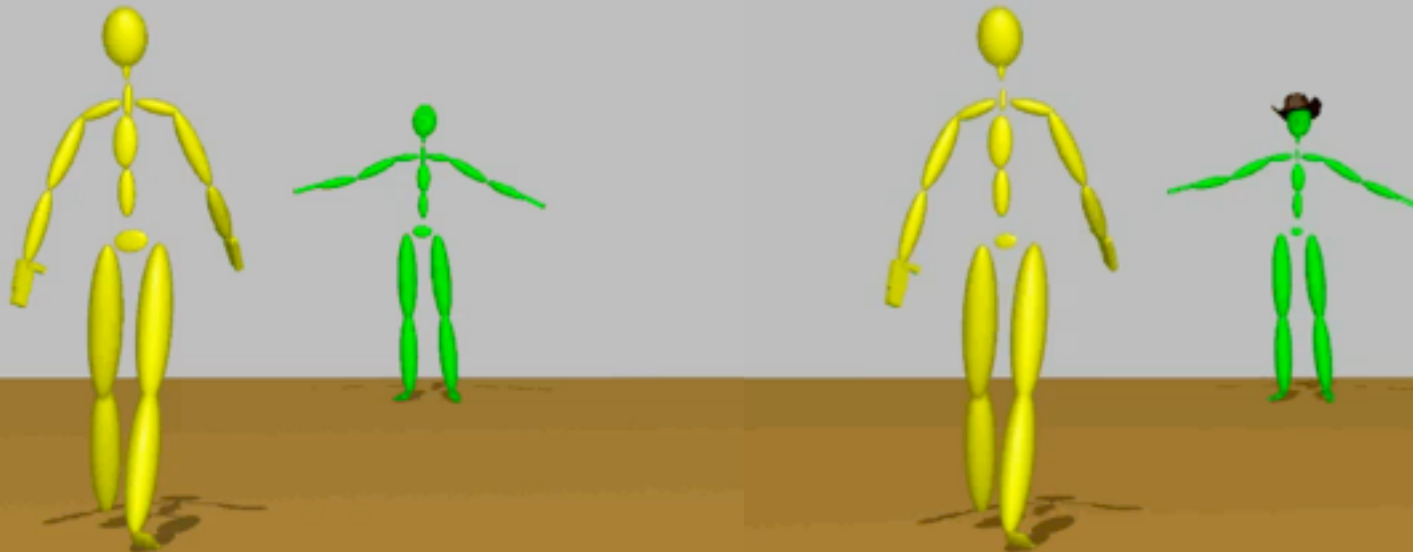


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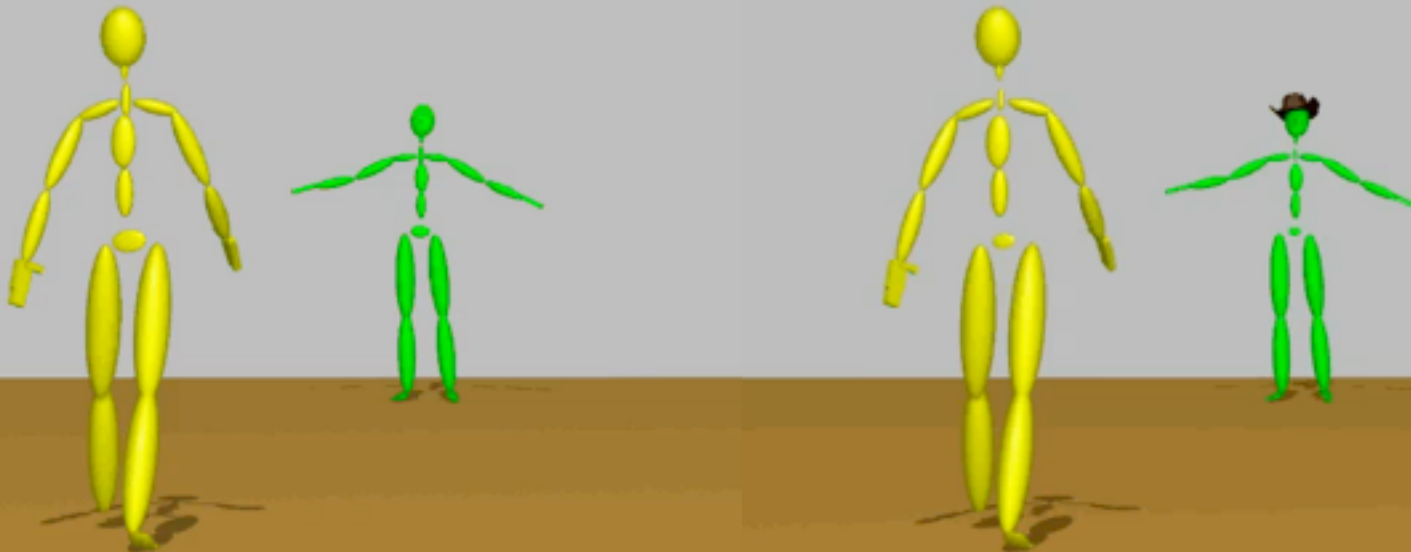


# Stealing a hat

Original motions

A) Hat set as a “pick up” target

B) Hat is released on “head” target



# Flipping with Physics!

[with Majkowska, Zordan] [SCA 07]

## *Physics-based replication of ballistic motions*

- Single back flip to double back flip
- Do not try this at home!
- ....seriously.

# Flipping with Physics!

[with Majkowska, Zordan] [SCA 07]

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# Flipping with Physics!

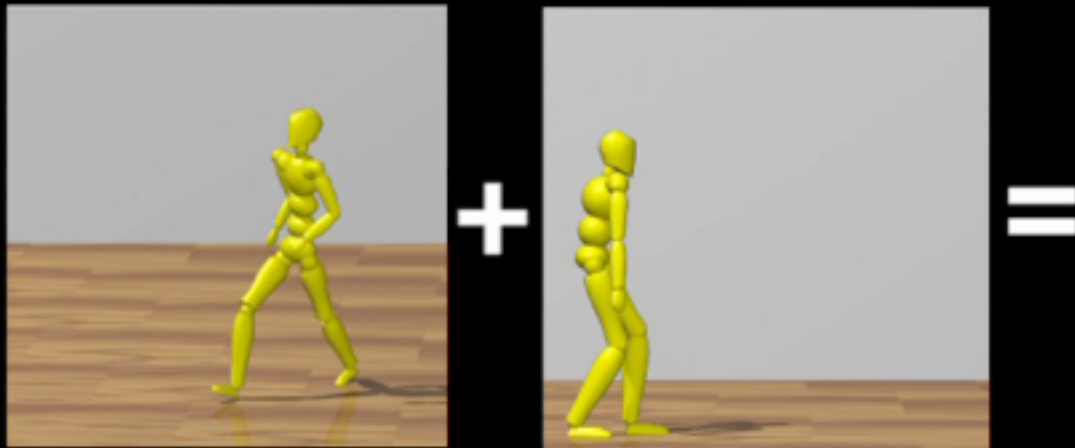
[with Majkowska, Zordan] [SCA 07]

---

# Flipping with Physics!

[with Majkowska, Zordan] [SCA 07]

## Compositing Motions



- joins motions in ballistic phases
- assures momentum conservation

# Flipping with Physics!

[with Majkowska, Zordan] [SCA 07]

## *Summary of the method*

- Estimate mass and momenta from the motion.
- Search the data to find a looping sequence.
- Rotate the looping sequence around the axis of angular momentum as needed.
- Adjust the trajectory of the center of mass to preserve linear momentum.
- Retime the take-off phase.



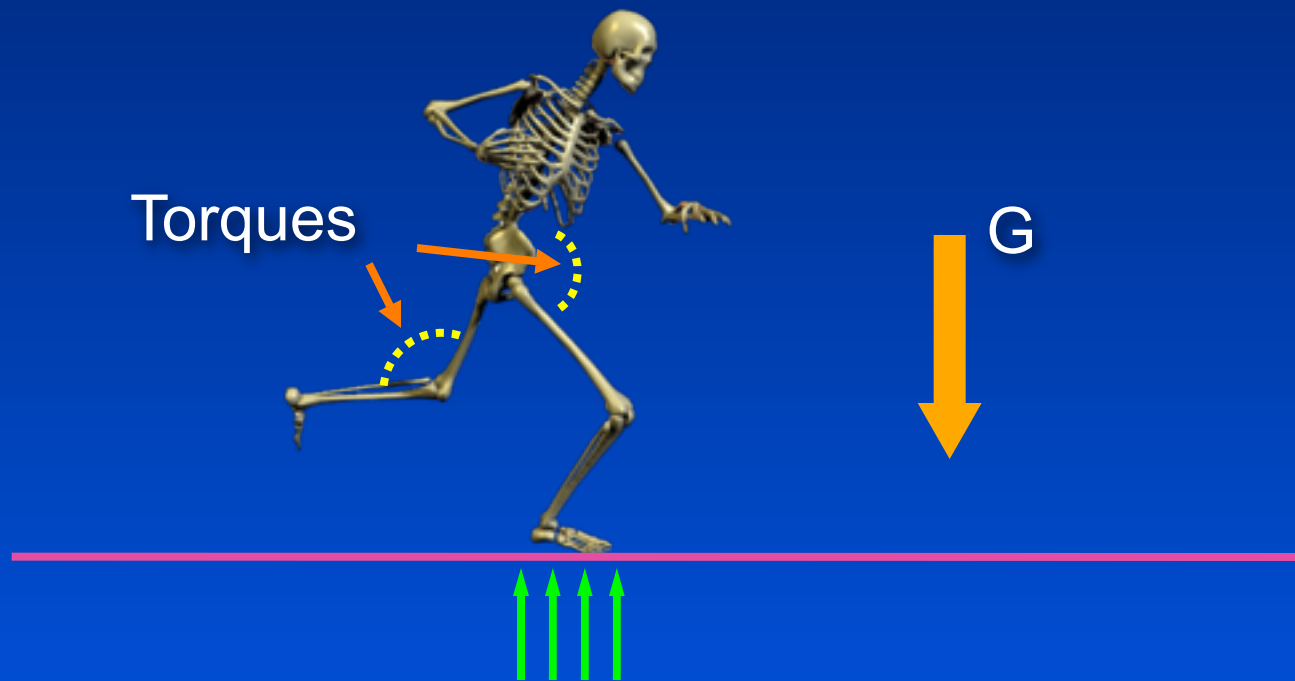
# Motion Synthesis: Physics-based Simulation

*Reality:*

*physics + control*



# Physics



# Applying Newtonian Mechanics

## *Equations of motion*

$$M(\mathbf{q})\ddot{\mathbf{q}} + C(\mathbf{q}, \dot{\mathbf{q}}) = \sum_i \mathbf{J}_T^T \mathbf{f}_i + \sum_j \mathbf{J}_R^T \tau_{ext,j} + \sum_k \mathbf{J}_R^T \tau_{int,k}$$

Inertial  
Forces

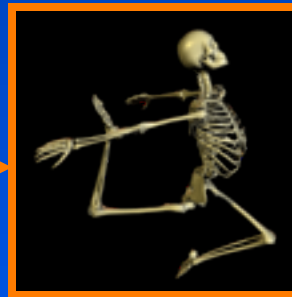
Gyroscopic  
Forces

External  
Forces

External  
Torques

Joint  
Torques

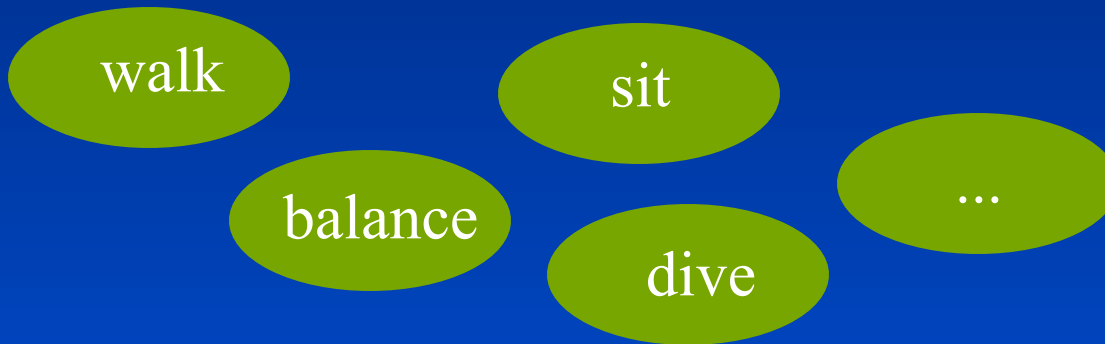
$[\mathbf{f}_i \ \tau_{ext,j} \ \tau_{int,k}]$



State  $[\mathbf{q} \ \dot{\mathbf{q}}]$

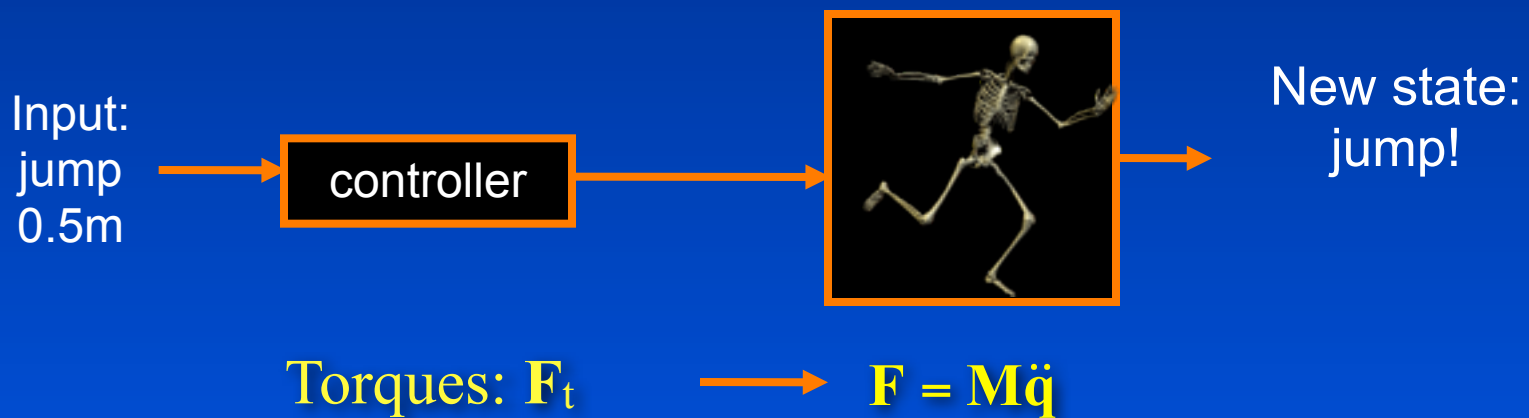
# Problem: Control

Divide and conquer



# What is a “Controller”?

*An algorithm that computes torques at the joints of a character to produce a desired motion*



# Questions

---

*How do we design controllers?*

*How do we switch between controllers?*

# Designing Controllers

## Challenges

- The human body has many degrees of freedom
- Our motions are dynamic (unstable) and/or highly optimized
- Thus, the control space is large with many local optima
- Natural look is difficult to describe mathematically

## Learning?

- How do babies learn to move?

## Optimal Control





# Evolving Physics-based Controllers for bipeds [with Brian Allen]

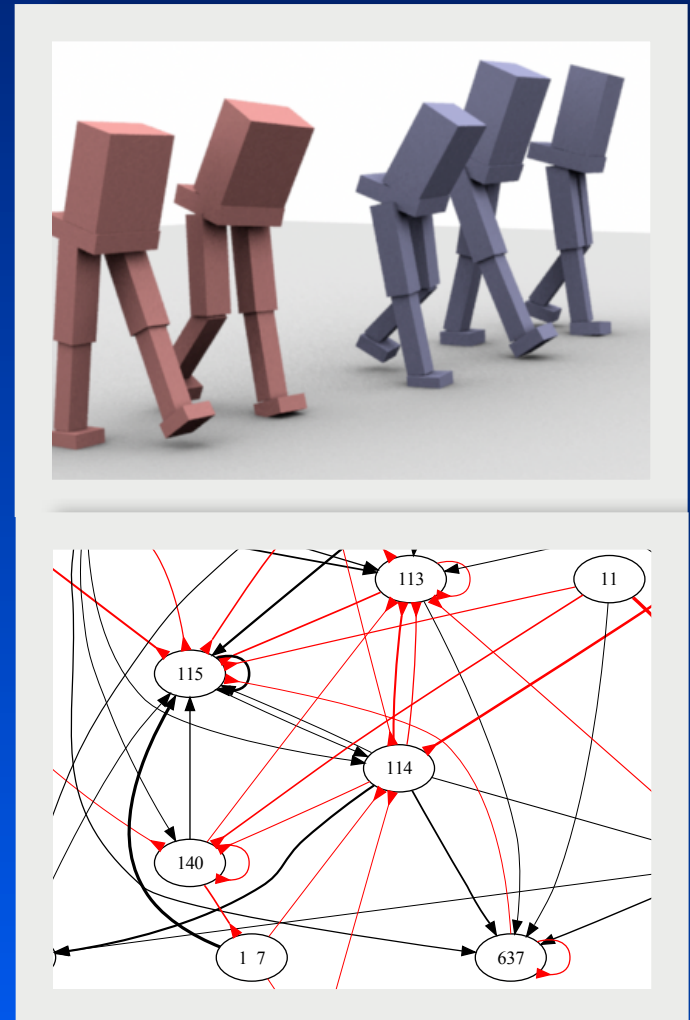
**Goal:** *Blackbox controller generator*

**Control structure:** *Neural Network*

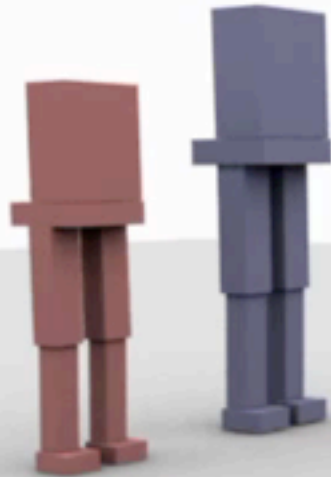
**Evolution through a genetic approach**

## **Key innovations**

- Evolve the network topology and the muscle parameters
- Use no prior knowledge (patterns etc)
- Use simple fitness function
- Introduce NEAT to graphics
  - *Historical markers*
  - *Speciation*

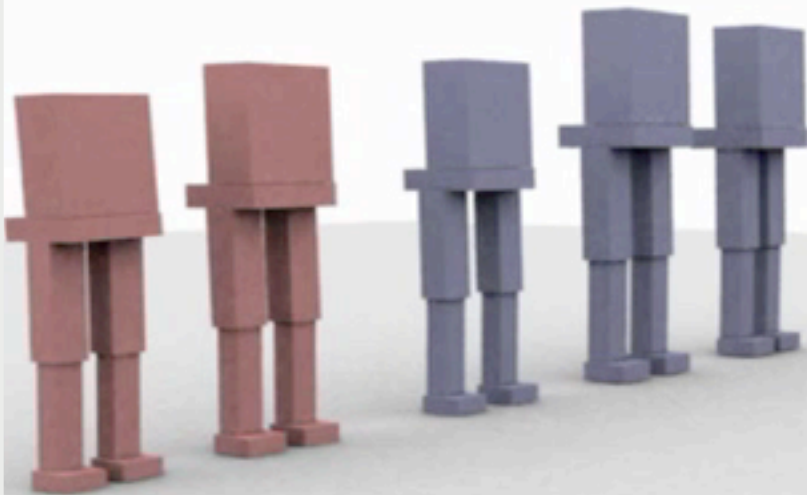


Humanoids of average male (blue) and female (red) height, weight and hip width.



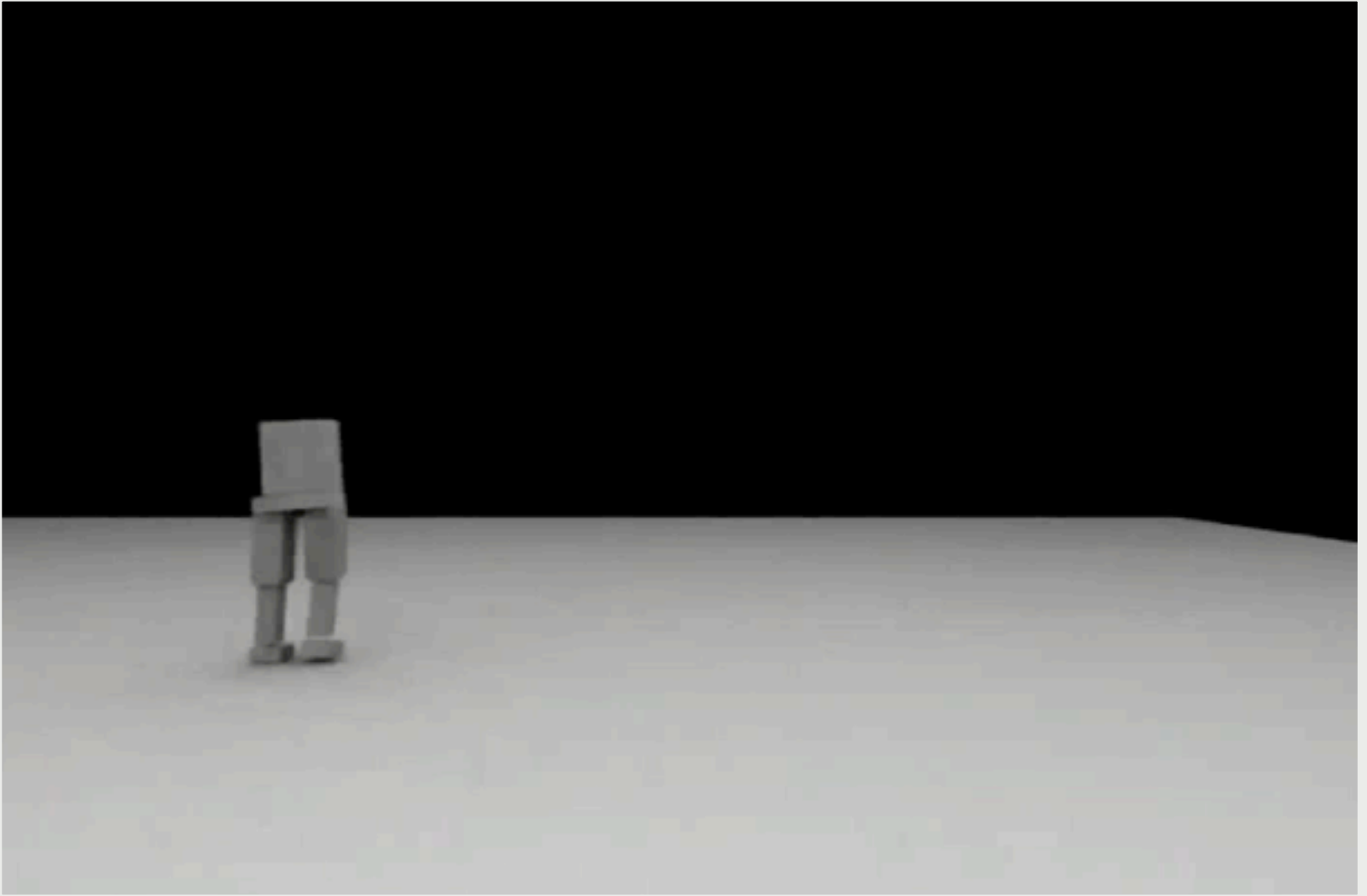
Humanoids spanning one standard-deviation of male (blue) and female (red) height and weight.

Humanoids spanning one standard-deviation of male (blue) and female (red) height and weight.



# **“The Ministry of Silly Walks”**

(with apologies to Monty Python)



# “The Ministry of Silly Walks”

(with apologies to Monty Python)

# Biomechanical modeling of the head and neck

*Sung Hee Lee and Demetri Terzopoulos*

*Muscle modeling*

*Control*

*Tension control*

# **Heads Up!**

## **Biomechanical Modeling and Neuromuscular Control of the Neck**

**Sung-Hee Lee      Demetri Terzopoulos**  
**University of California, Los Angeles**





# Composing Controllers

[SIGGRAPH 2001] [C&G 2001 (Best Paper Award)]

**Goal:**

***Create physics-based characters that can react to their environment and to user interaction***



# Results

## *Falling and getting up*

- 5 Controllers:
  - *Default*
  - *Fall*
  - *Roll over*
  - *Get up*
  - *Balance*



# Multiple solutions - Planning

---

## Controllers

- Default
- SitUpGetUp
- Balance

## Controllers

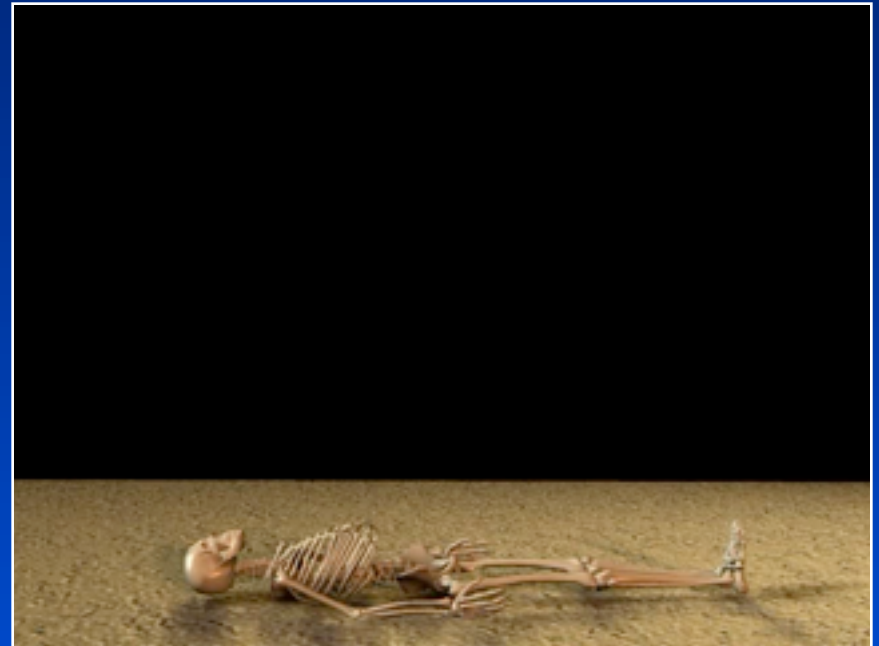
- Default
- Kip
- Balance

# Multiple solutions - Planning



## Controllers

- Default
- SitUpGetUp
- Balance



## Controllers

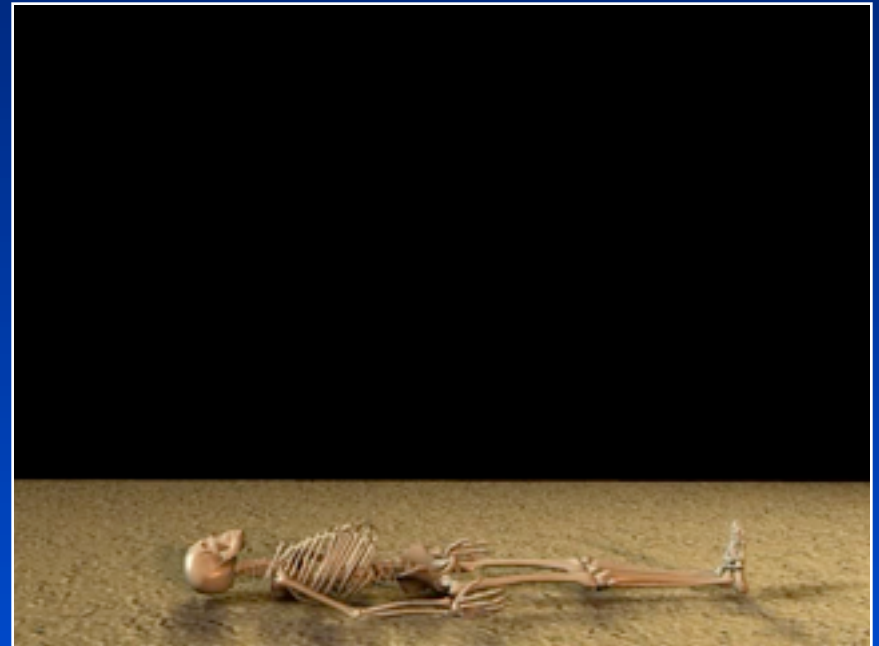
- Default
- Kip
- Balance

# Multiple solutions - Planning



## Controllers

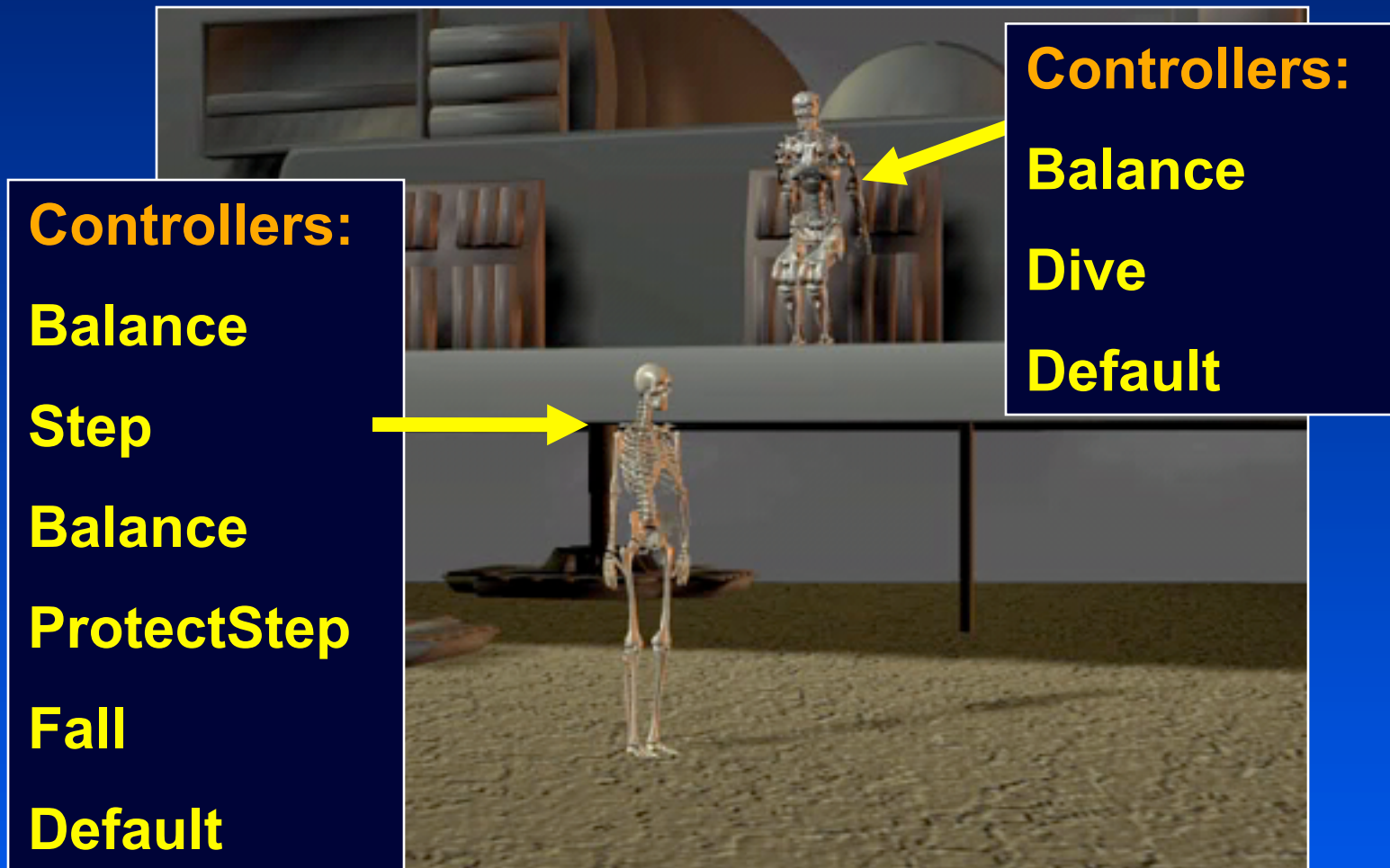
- Default
- SitUpGetUp
- Balance



## Controllers

- Default
- Kip
- Balance

# Multiple Characters





# Multiple Characters



# Hybrid Control with Ari Shapiro and Fred Pighin

[SIGGRAPH Tech Sketch 03, Pacific graphics 03]

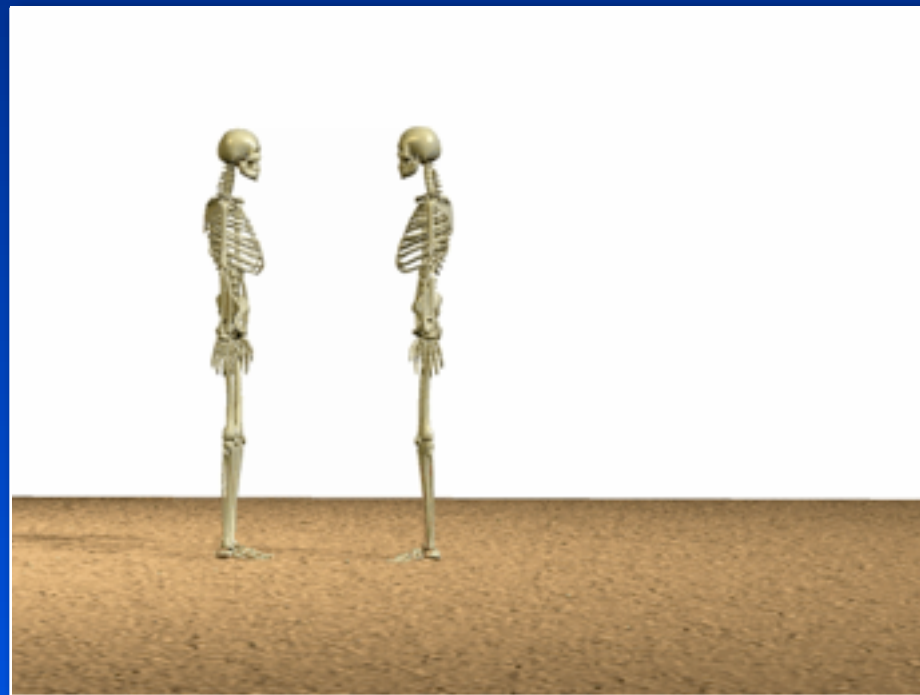
## **Combine kinematic and dynamic control**

- Leverage advantages of both

### **Key idea**

- Use motion data until there is interaction, then use physics

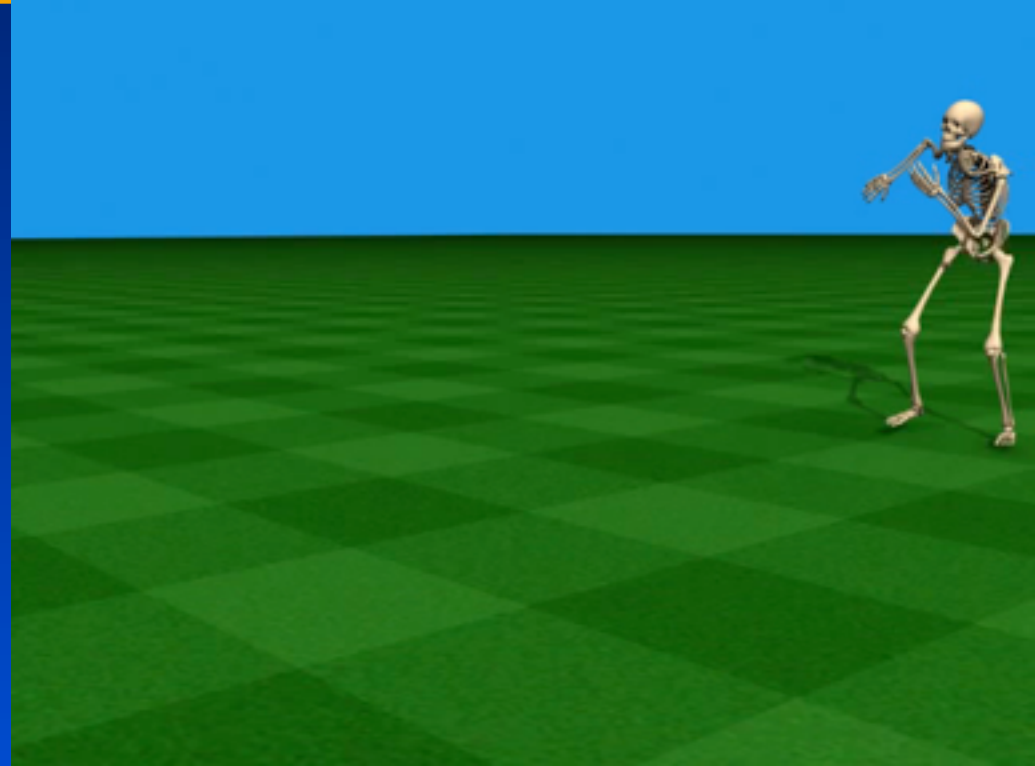
## **First demonstration of hybrid control**





# Kinematic Control

*Motion captured walk*

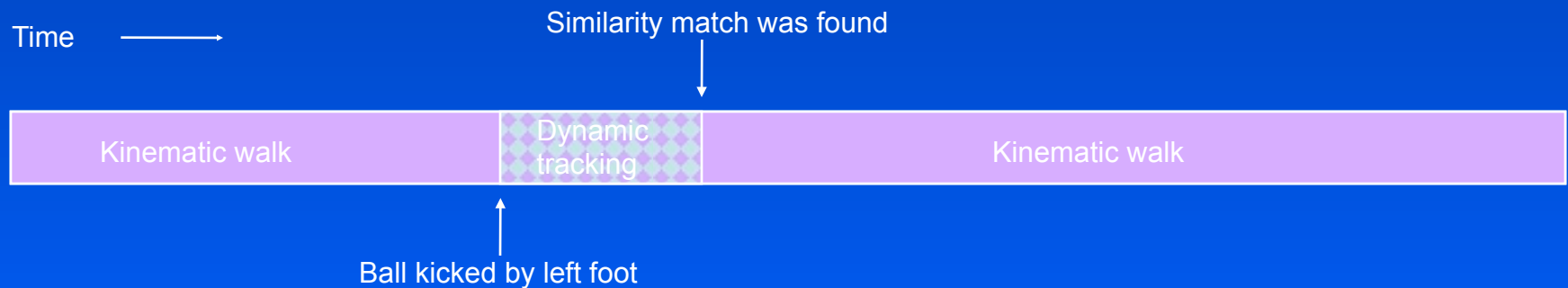
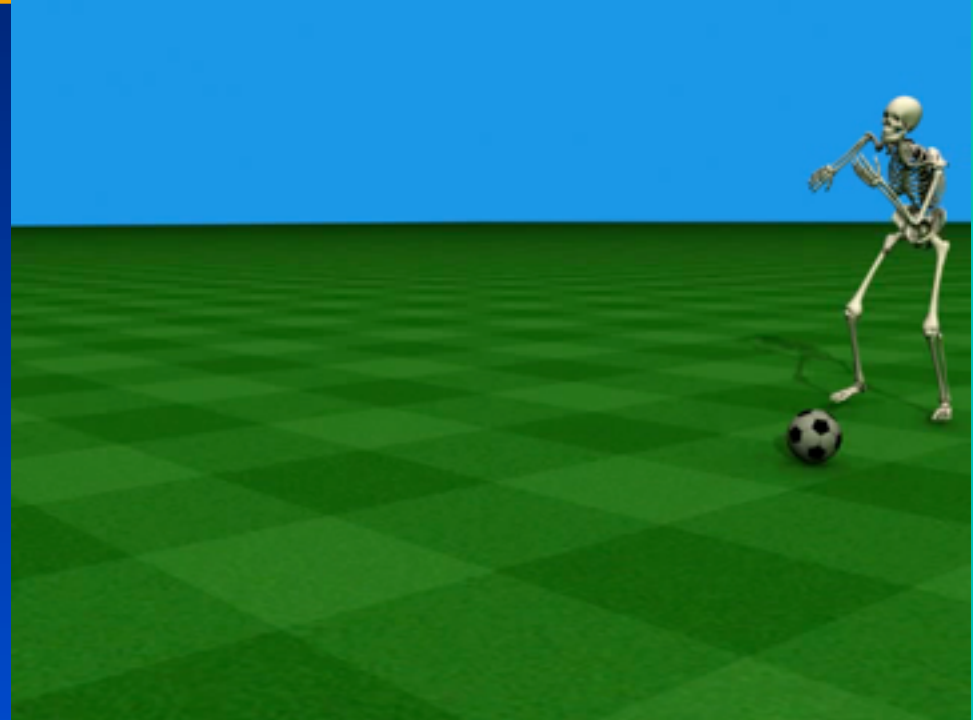


Time →

Kinematic walk

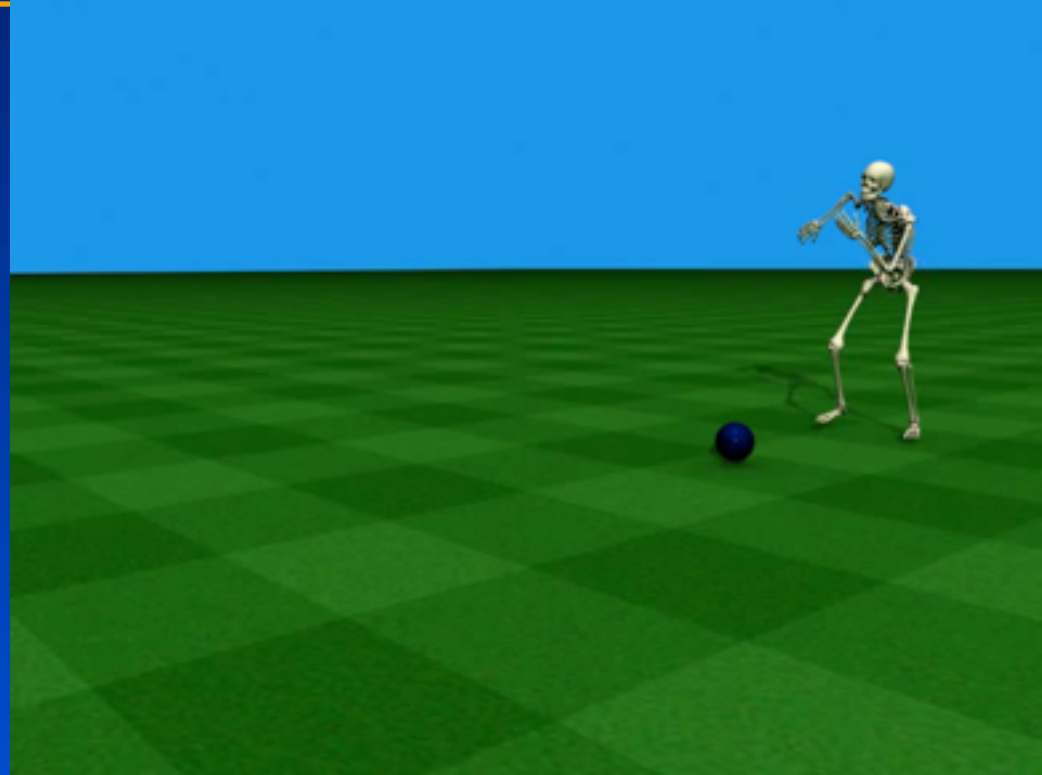
# Dealing with a minor Disturbance

*Dynamic ball placed  
in walk path*



# Major Disturbance: Switch To Dynamic Control

*Heavy dynamic  
ball obstructing  
walk path*



# Multiple Characters and Objects

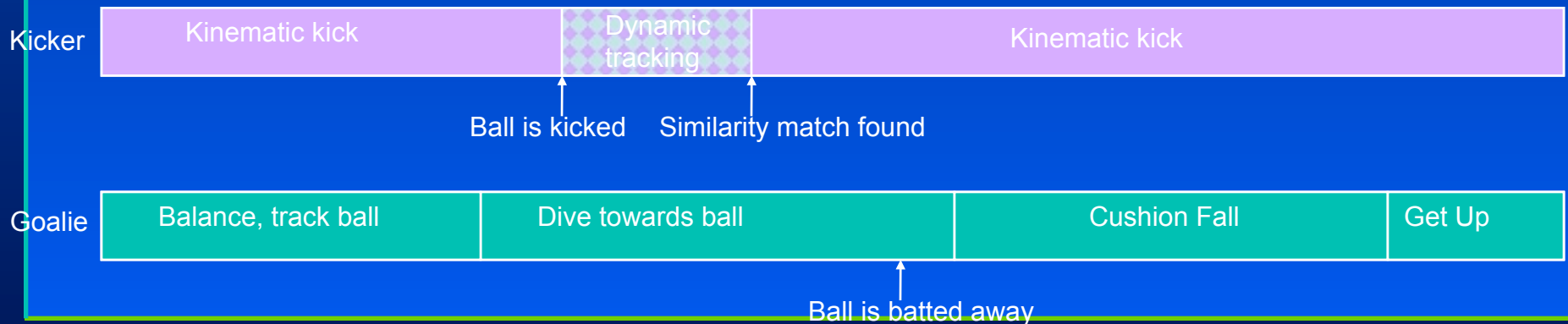
***Kinematic kicker***

***Dynamic ball***

***Dynamic goalie***



Time →



# Crowd Simulation

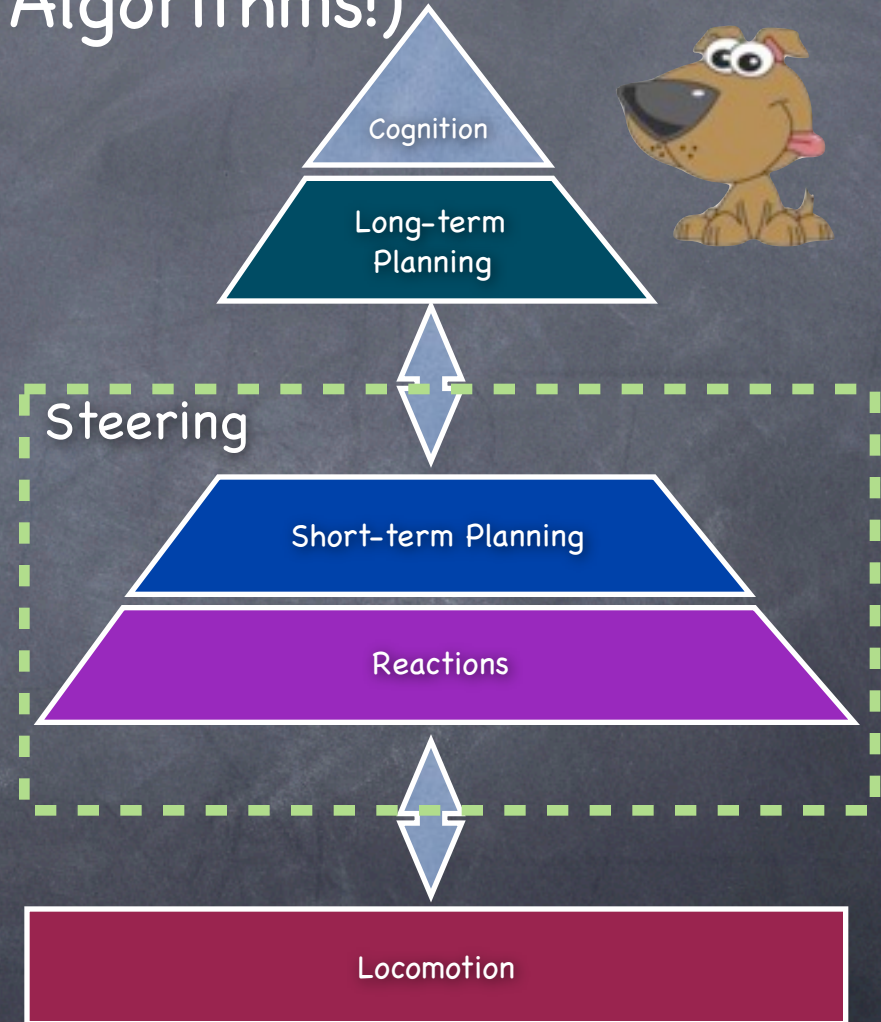
(...and why we love AI and Algorithms!)



Steering:

Agent moves from A to B at the presence of dynamic and static obstacles

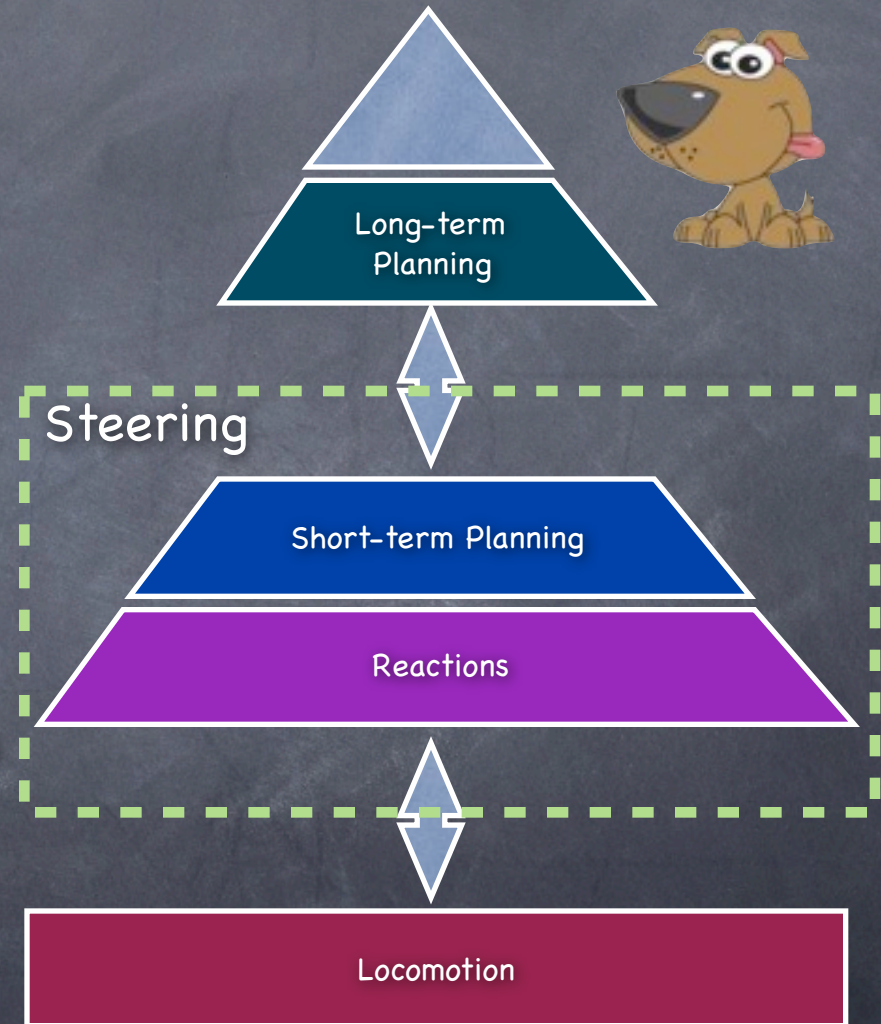
Modeling the agent's steering decision process





# Why is it complex?

- Agent Individuality
- Agent coordination
  - Verbal and Non-verbal communication
- Social Etiquettes
- State and Context specific behaviors
- Limited sensory information
- Prediction based decisions
- Deadlock resolution
- Memory
- Locomotion constraints

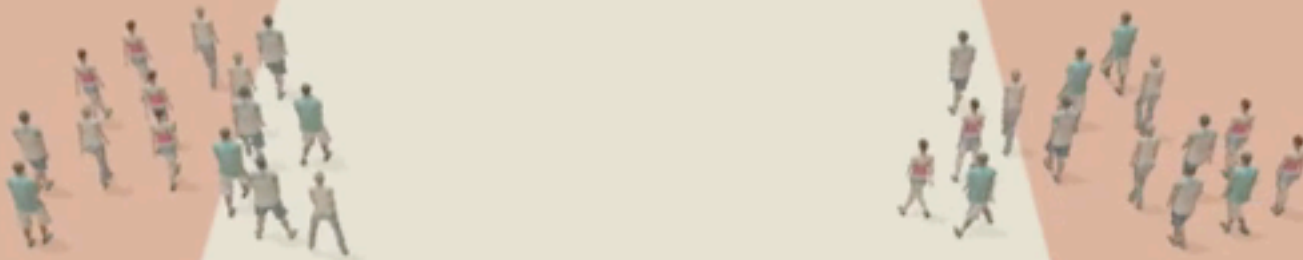




# Authoring Behaviors [Schuerman et al. *CASA* 2010]

# Authoring Behaviors [Schuerman et al. *CASA* 2010]

Scenario X: Interactive Hierarchical Agents



(2x speed)

Triangle

Rectangle



# Scaling Problem: e.g. 100K Agents

- Maintaining the world database
- Persistence of agents (levels of detail?)
- Querying the database
  - Nearest neighbors
  - Visible objects
- Animating the agents
  - Attention control
  - Locomotion
- Parallelization?





# Don't computer games do it?

## GTA IV

user controlled





# Don't computer games do it?

## GTA IV





# Computer Games Cut Lots of Corners



- Model mostly homogeneous crowds
- Use levels of details (e.g. primary, secondary characters)
- Simulate only a few agents at a time
- Rely on physics for collision prevention
- Simplify and modularize the problem with as little communication as possible between modules
  - Particle disks representing humans
- Pre-compute as much as possible

# Example of problems with simple sliding particles

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# Example of problems with simple sliding particles

Scenario IV: Larger Crossing Groups  
(with Group Agents)



(1.5x speed)

# Space-Time Planning of Footsteps

[CASA 10, CASA 11]

## ***Footsteps with precise timing information***

- Sufficiently detailed information to motion synthesis
- Dynamic collision bounds
- Efficient space-time planning satisfies user defined constraints and physical costs (effort)
- Heterogeneous agents

## ***Locomotion model in steering***

- Inverted pendulum with proper locomotion constraints

***Motion synthesis has to follow footsteps rather than a velocity vector***

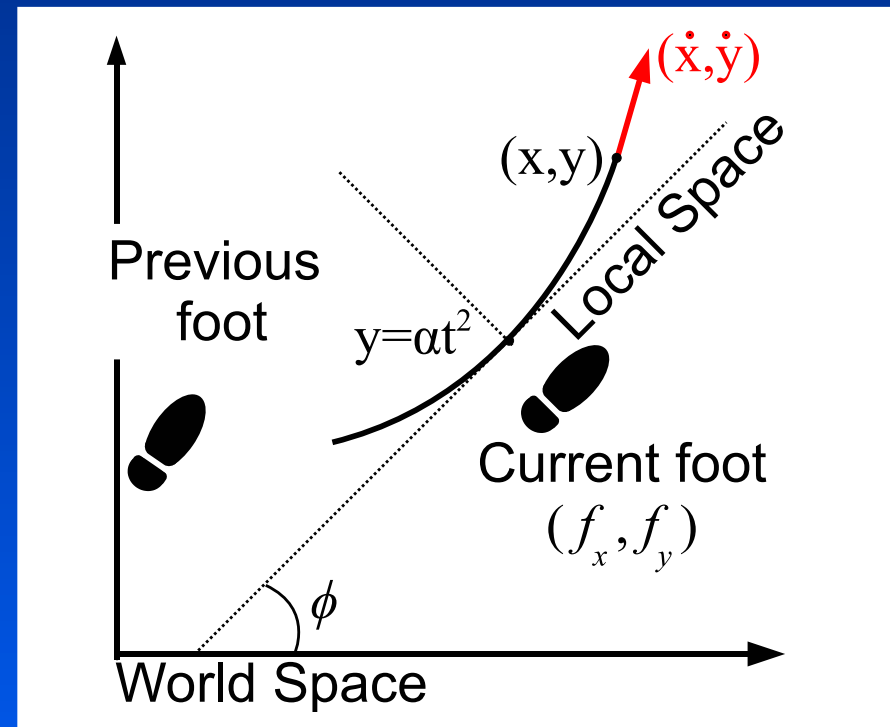
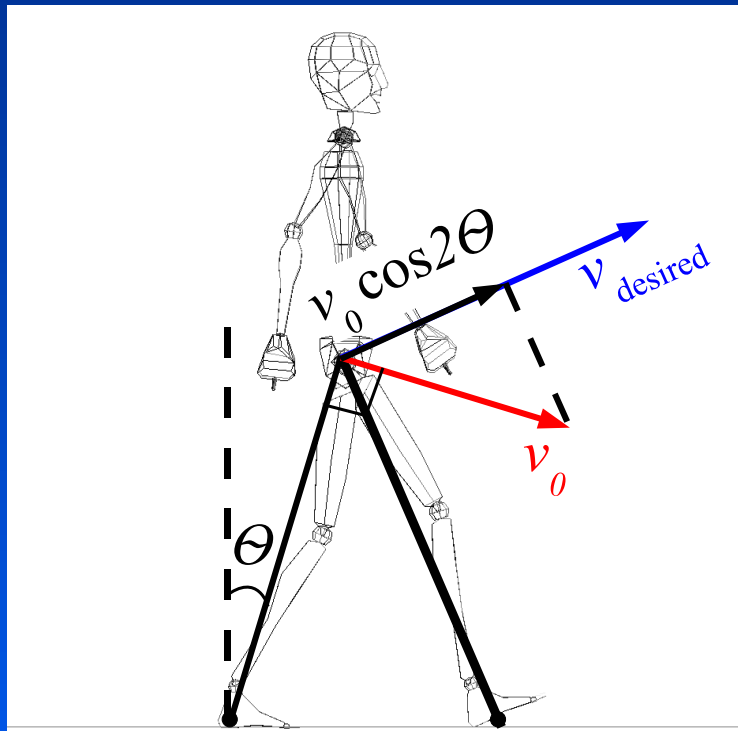


# Space-Time Planning of Footsteps

[CASA 10, CASA 11]

## Our locomotion model in steering:

- 3D inverted Pendulum

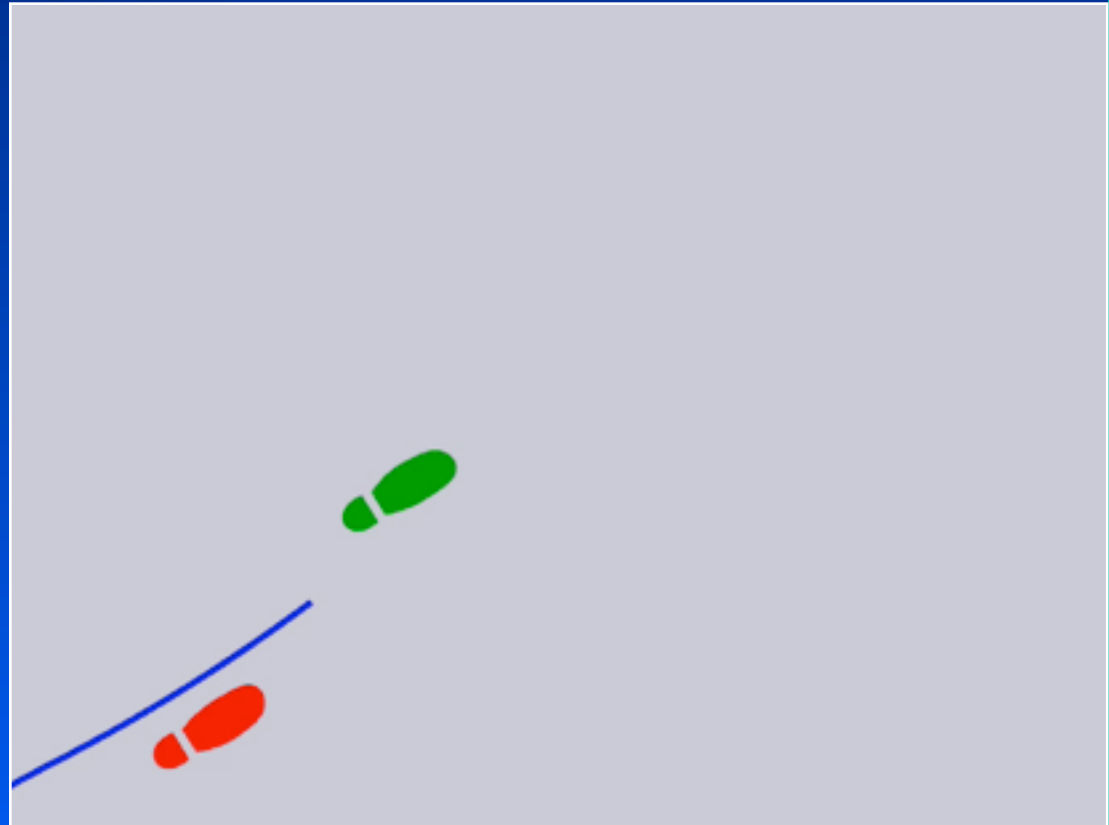




# Space-Time Planning of Footsteps

## *Computing a sequence of steps 10 meters ahead*

- The 3D inverted pendulum model defines the action space and the cost of action for a space-time planner



# Space-Time Planning of Footsteps

[CASA 10,CASA 11]

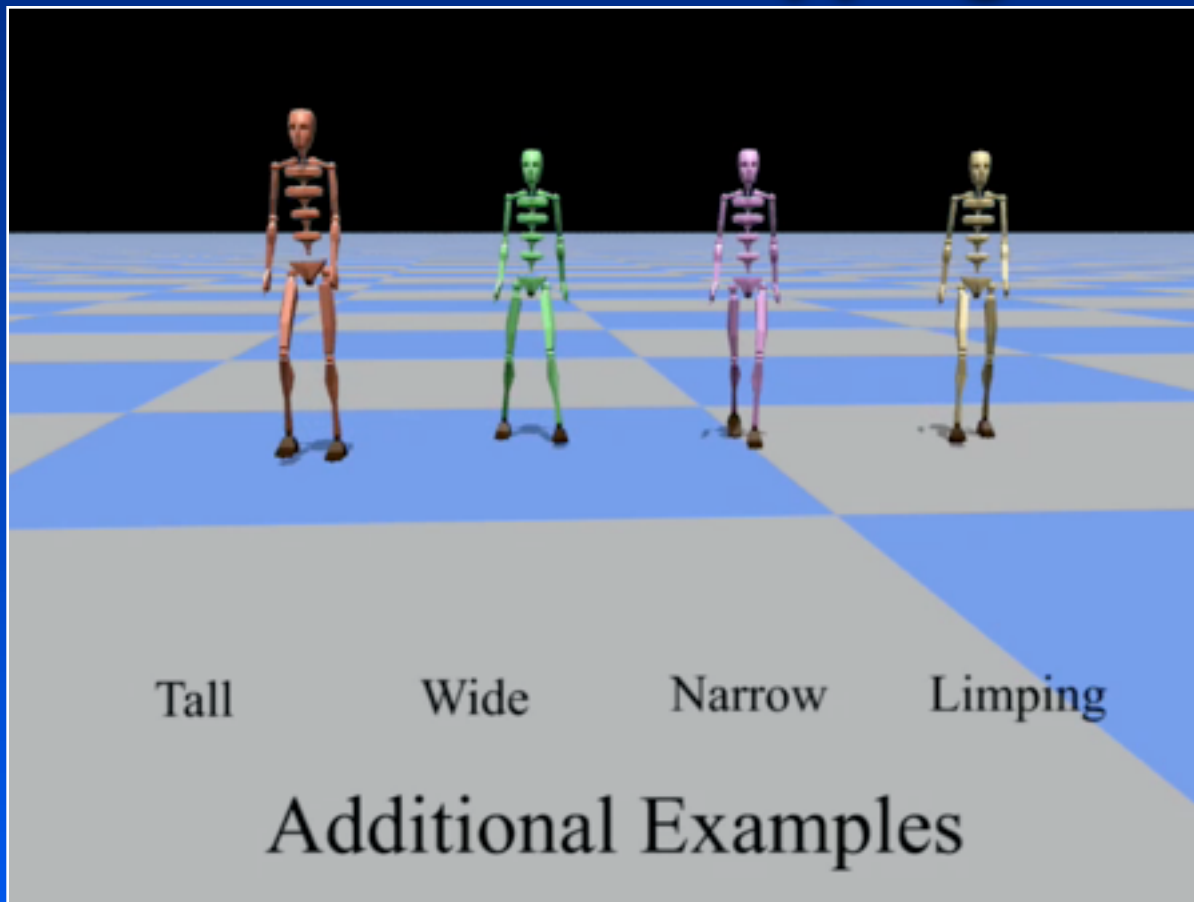
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*User constraints in the stepping model*

# Space-Time Planning of Footsteps

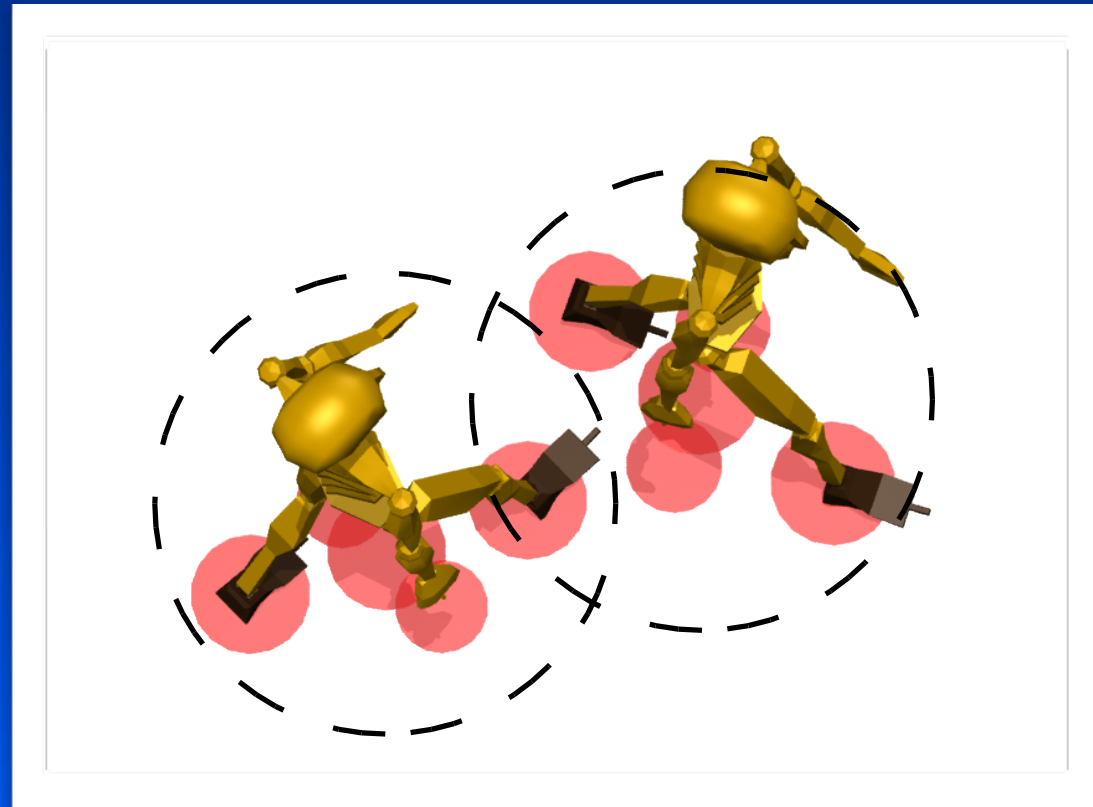
[CASA 10,CASA 11]

## *User constraints in the stepping model*



# Space-Time Planning of Footsteps

*Time-varying collisions bounds*



# Space-Time Planning of Footsteps

[CASA 10, CASA 11]



# Sketch-based Facial Animation

[with Gabriele Nataneli] [ISVC 07, IEEE CG&A 10]



## ***Goal: From sketches to 3D faces***

- Enable quick prototyping
- Make life easy for animators
- Support low-power mobile devices (e.g. iPhone)

# Challenge: Sketches are arbitrary

*Eye brow can be one stroke*



*... or multiple strokes*



***Sketch abstraction and representation is the key***

- must be able to generalize sketch elements
- must be able to discriminate between elements

# Robust sketch recognition

## *Main idea*

- Find a simpler problem that can be classified well
- Transform more complex problems into the simpler one

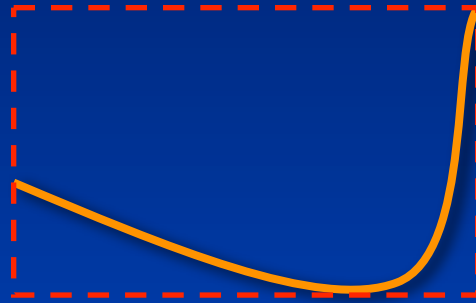
## *Contributions*

- A machine learning approach for clean sketch recognition
- A set of statistically well-behaved features for stroke abstraction
- A robust approach for grouping of strokes to get clean sketches

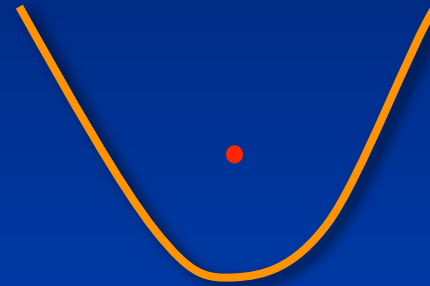


# Abstraction of sketches through Shape Attributes

## *Individual*

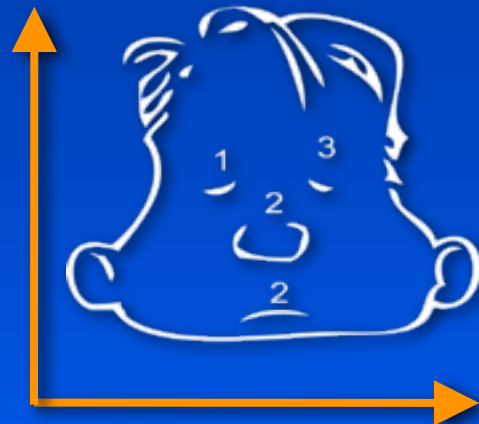


Bounding Box



Centroid

## *Relational*



Horizontal Ordering



Depth

# Three-step framework

**Step I: Labeling -- Results: e.g. stroke1:left eyebrow, stroke2:mouth**

- Segmentation
- Recognition
- Grouping

**Step II: Match sketch elements to artist-provided face templates -- Results: e.g. stroke1: angry eyebrow, stroke2: open smile**

- Distance based
  - Average Hausdorff distance
  - Frechet distance
- Attribute based (convexity, topology, bounding box)

**Step III: Quantify the intention of each element -- Results: e.g. little smile, medium angry eyebrows**

- Simple  $[0,1]$  value between pre-defined upper and lower bounds

# Set of Shape Attributes [Arnheim 74]

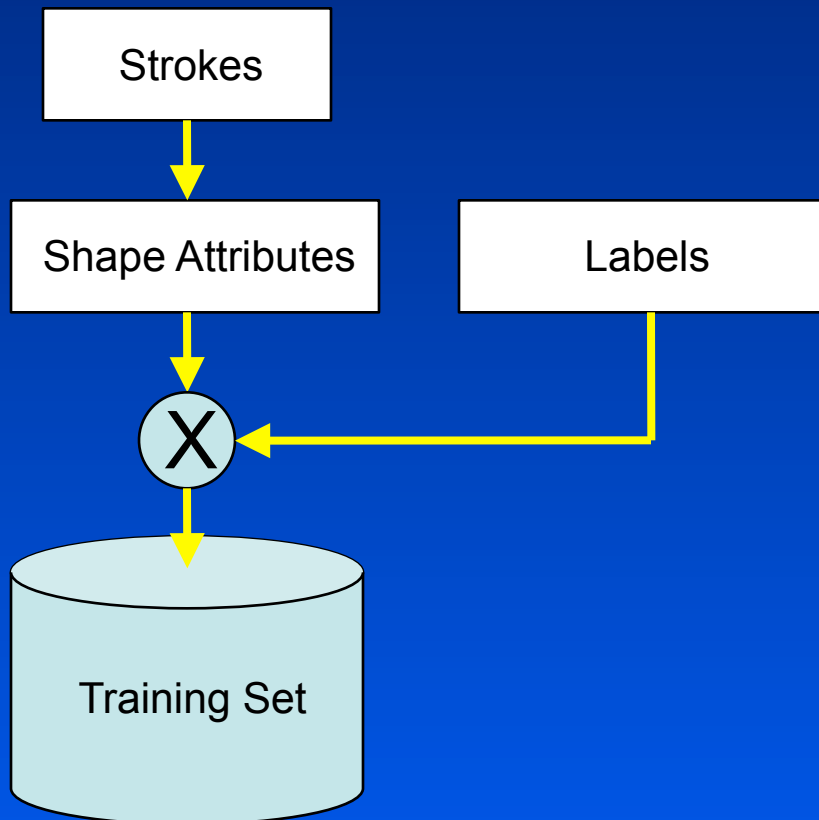
*Shape attributes are the features for the SVM*

Bounding Box Width
Bounding Box Height
Bounding Box Aspect Ratio
Centroid X
Centroid Y
Horizontal Ordering
Vertical Ordering
Overall Stroke Count
Depth

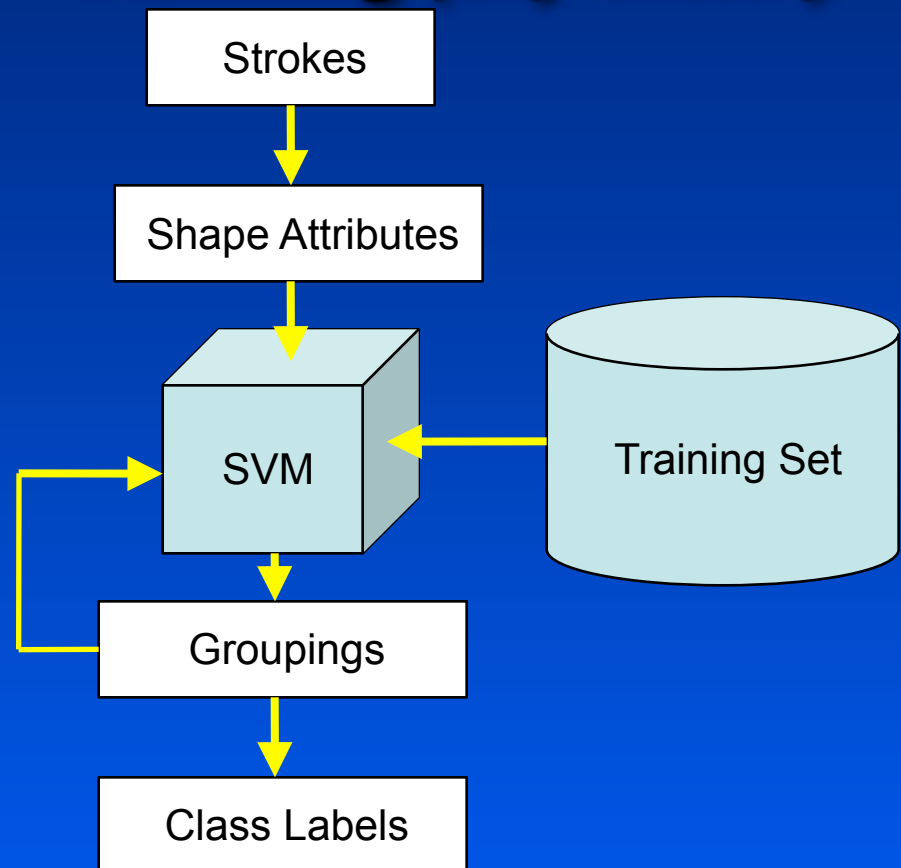
- Cross validation (93 % accuracy)

# Step I: Labeling with SVM classifier

## *Training (Clean sketch)*



## *Running (any sketch)*



# Grouping

**General problem is NP-hard : Many choices**

## Formalism

Sketch: Set of strokes

$$S = \{S_1, S_2, \dots, S_n\}$$

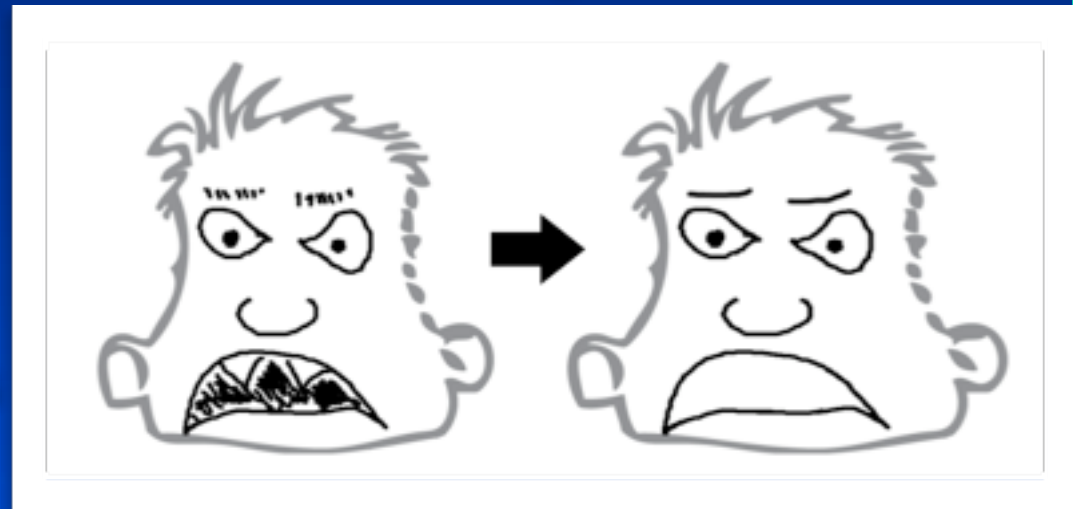
Grouping: set of groups

$$G = \{g_1, \dots, g_m\}$$

Such that

$$g_i \subset S$$

$$g_i \cap g_j = \emptyset \text{ for } i \neq j$$



# Grouping

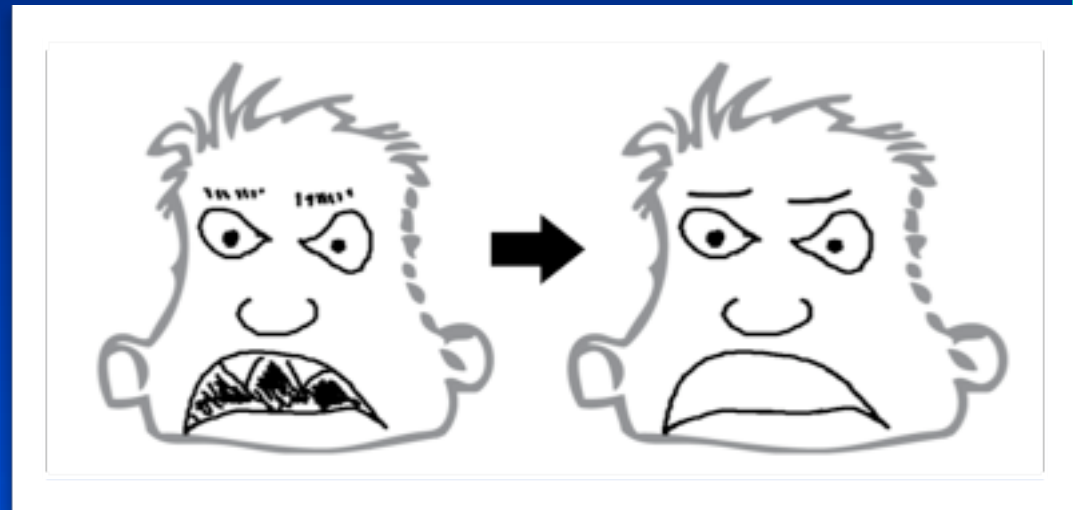
**General problem is NP-hard**

## **Must prune**

- Structural
- Overlap
- Semantic

## **Heuristic search**

- Keep the one that produces the highest number of distinct strokes



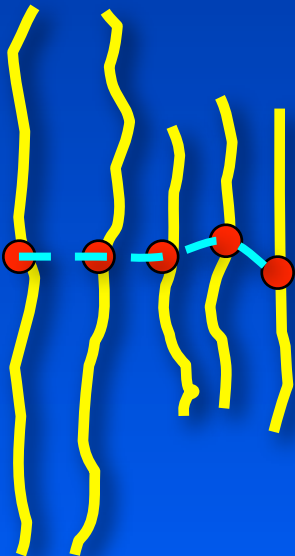
# Structural grouping

*Independent of training set*

*Similar to perceptual organizations*

*Primarily two kinds*

- Proximity



- Continuity

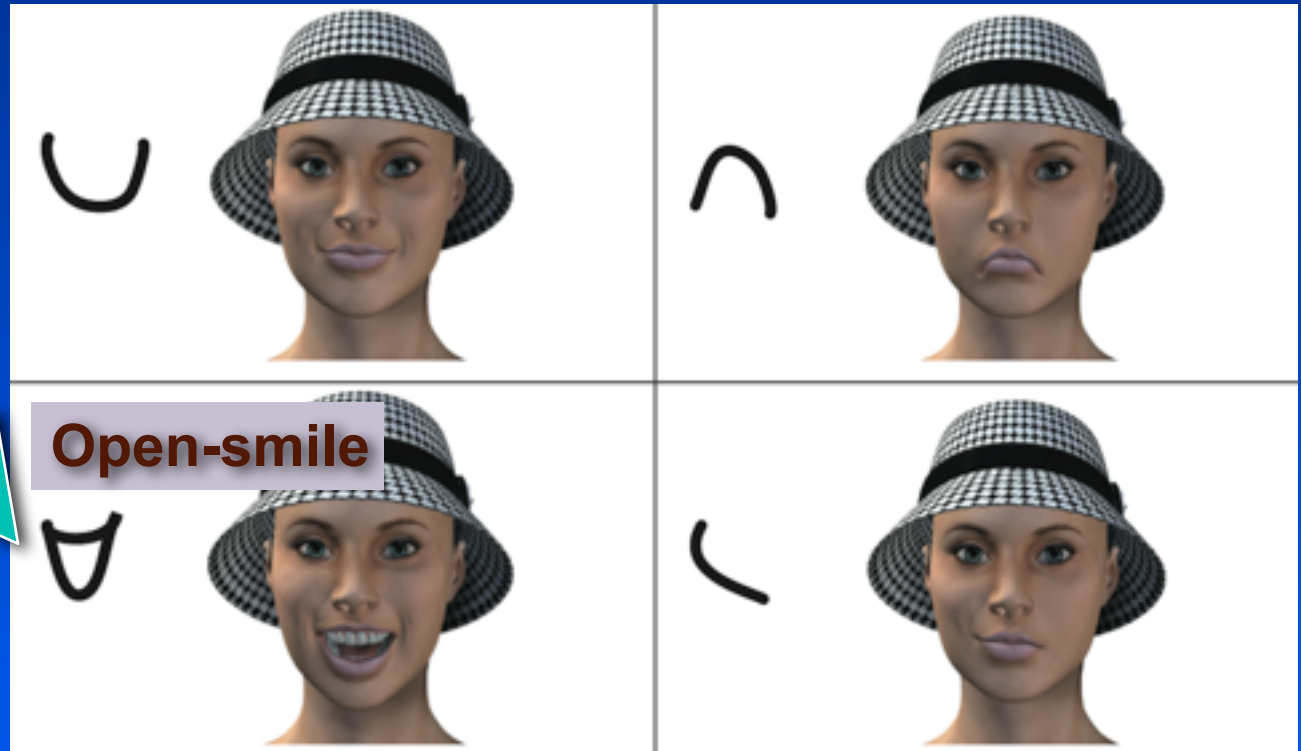
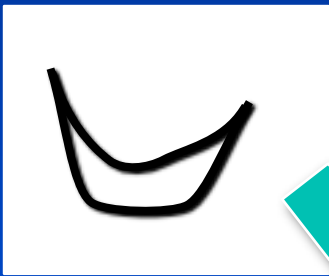


# Step II: Template matching

*Labelled Stroke*

*Template*

**Mouth**

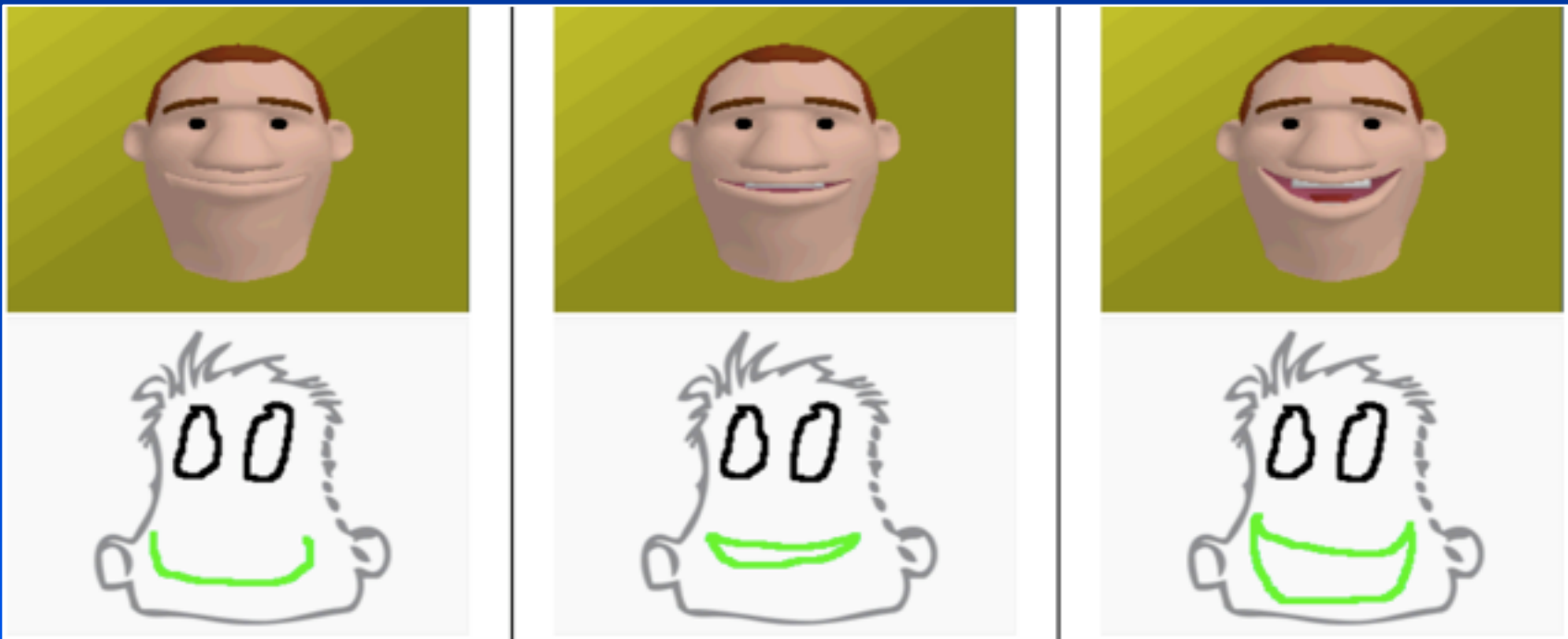




## Step III: Refinement

*Identify quantitatively the intention of the stroke*

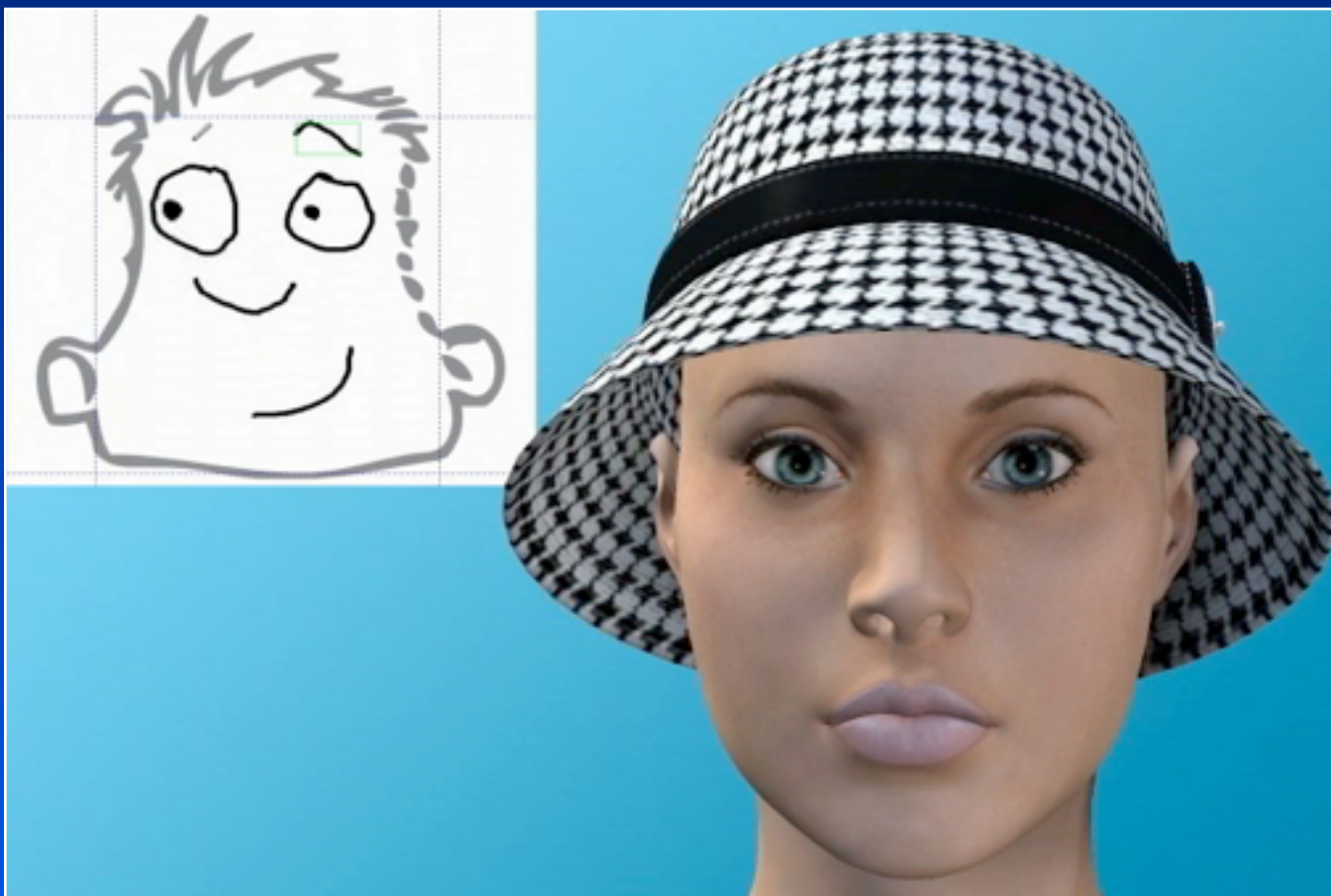
- Upper bounds on shape attributes in the templates



# Results



# Results



# Take home message

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*Everything you learn can lead to exciting careers*

- R&D for special effects studio
- Technical Director for a special effects studio
- Computer Games Programmer
- Software Engineer