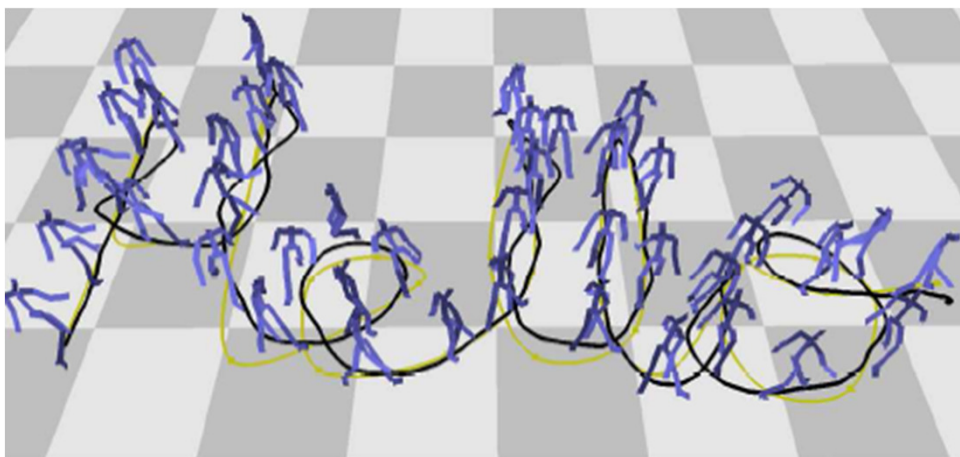


MOTION CAPTURE DATA PROCESSING

- MOTION EDITING / RETARGETING
 - MOTION CONTROL / GRAPH
 - INVERSE KINEMATIC
-

Alexandre Meyer

Master Informatique



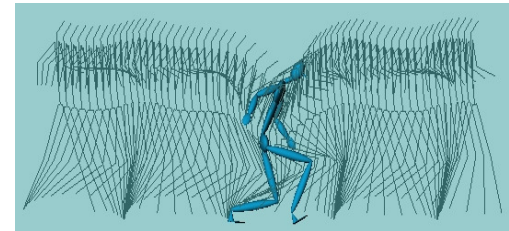
Overview: Motion data processing

In this course

- Motion editing
- Motion blending 2 animations
- Motion FSM/graph
- General Motion blending

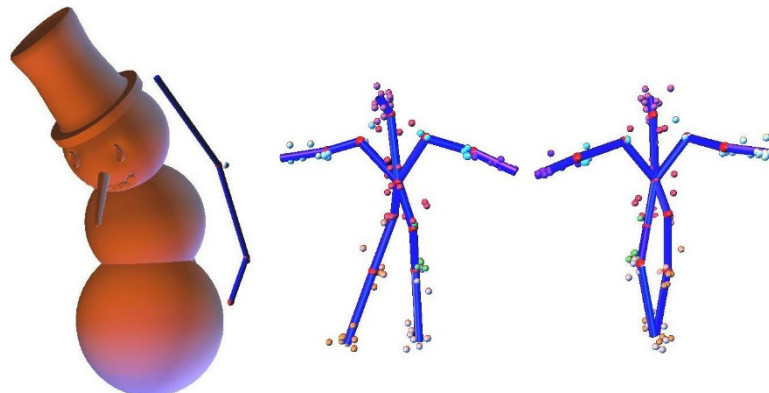
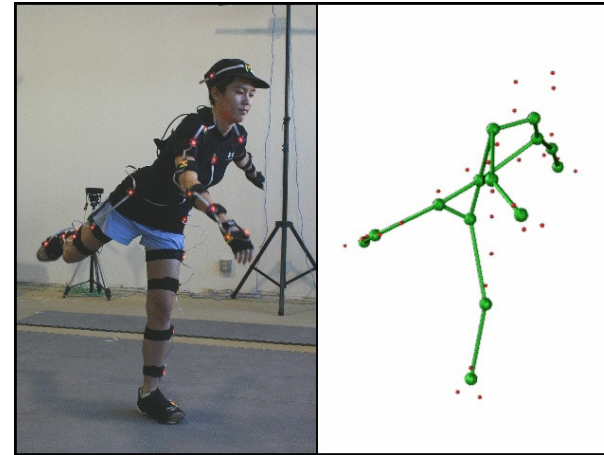
Not in this course

- Motion segmentation
- Motion compression
- Etc.



How do skeletons differ?

- Topology
 - number of bones
 - Connectivity of bones
- Joint Types
 - Bone lengths
 - Anatomical / skin relations
- Is spine in middle of body, or up the back?



Subtle Skeletal Differences

- Rest Poses (design of a skeleton)
 - Zero Pose / Base Pose
 - Dress or Binding pose
 - Frankenstein Pose
 - Da Vinci Pose
 - Rest Pose (real pose of actor)
- Need to figure out how to get between these

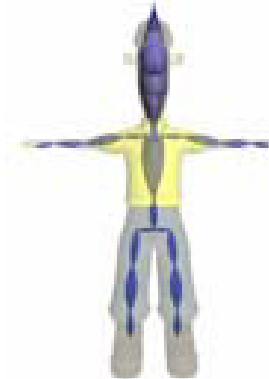
Rest pose



Subtle Skeletal Differences

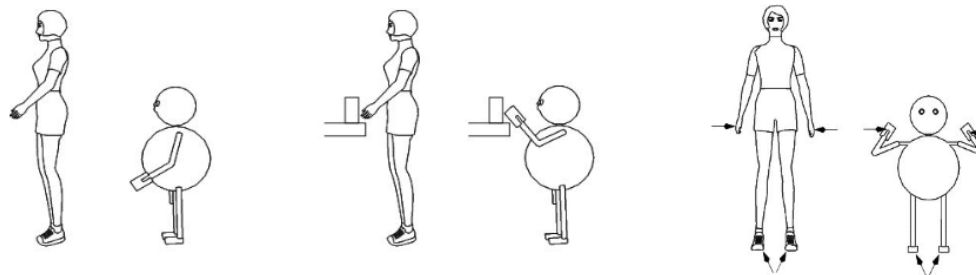
- Same angles lead to different animation if rest pose is different

Rest pose



Animation with similar angles

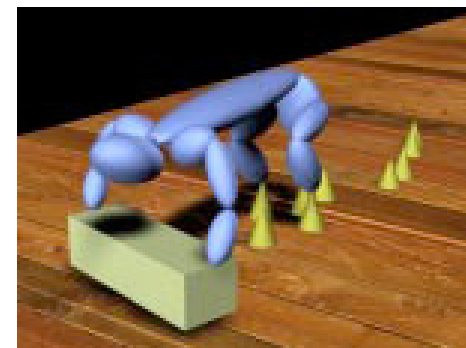
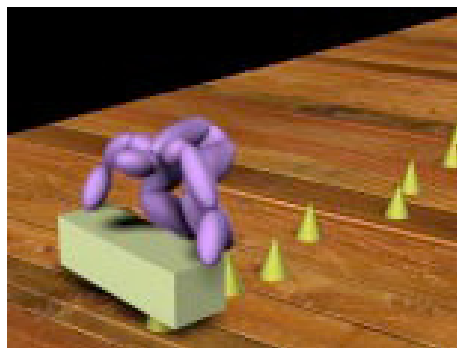
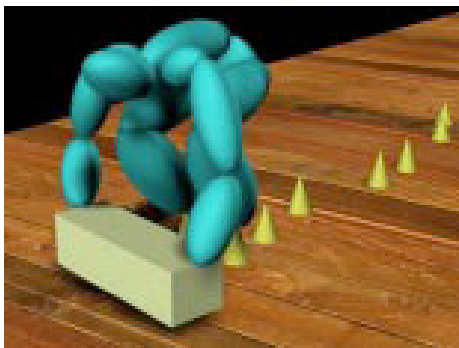




MOTION EDITING

Input: 1 pose of an animation

Edit One Pose: IK, retargeting

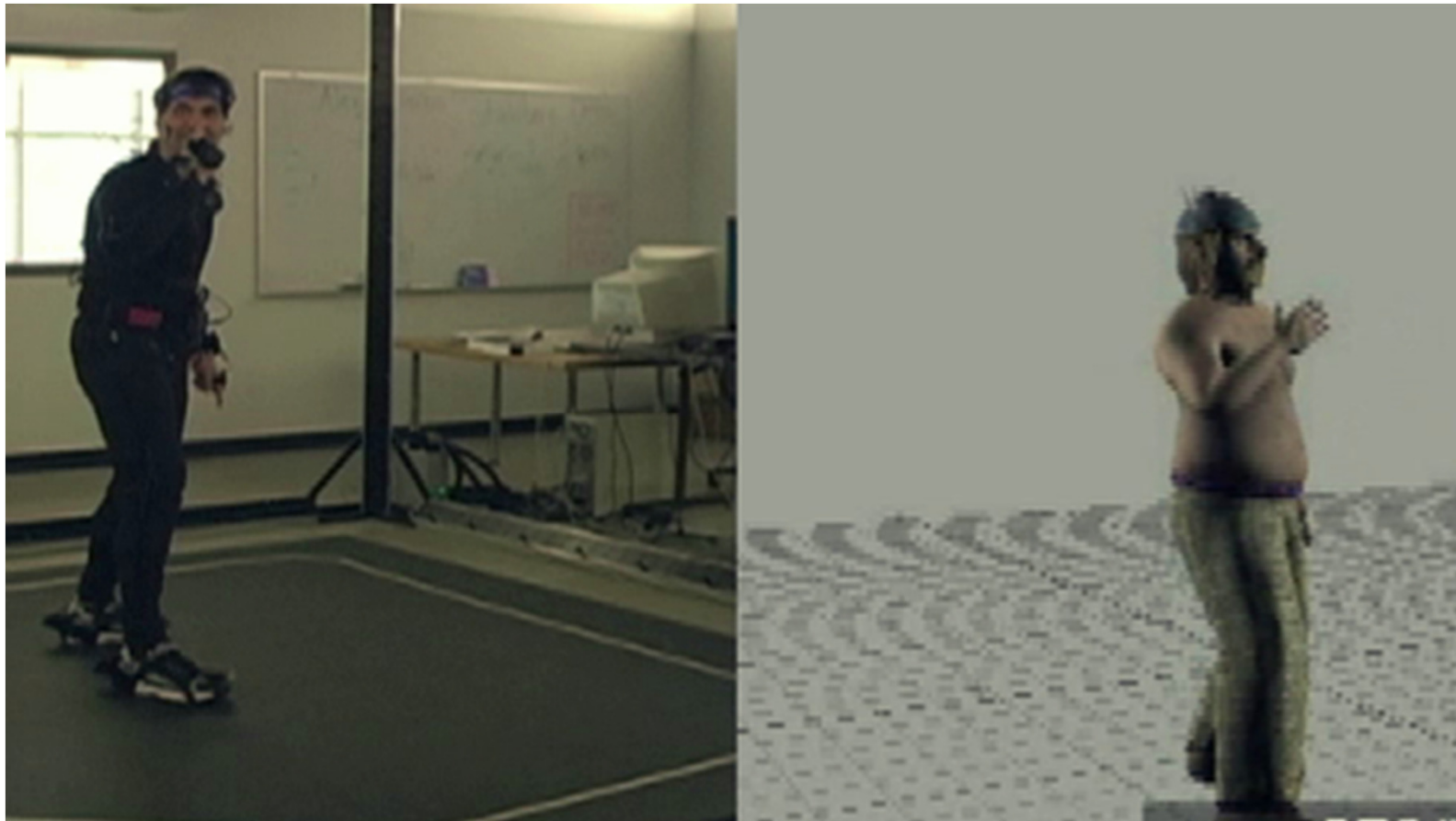


Retargeting

- capture motion on performer
 - **positions** of markers are recorded
- retarget motion on a virtual character
 - motion is usually applied to a skeleton
 - a skeleton is hierarchical
 - linked joints
 - need **rotation** data!
- need to convert positions to rotations

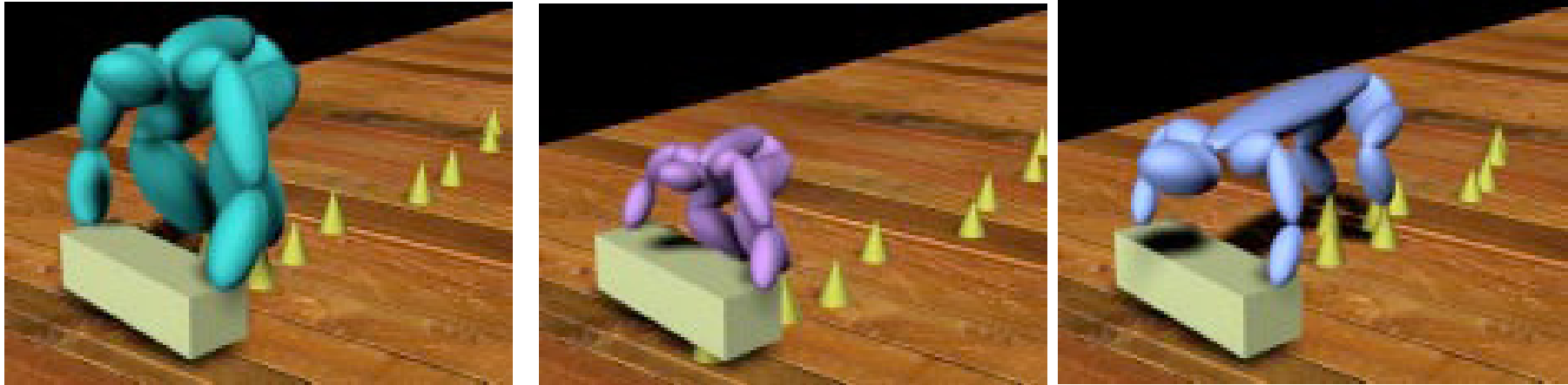


Retargeting problems: hand problem



Problem of Hand or foot position!

- Often hand or foot positions do not match

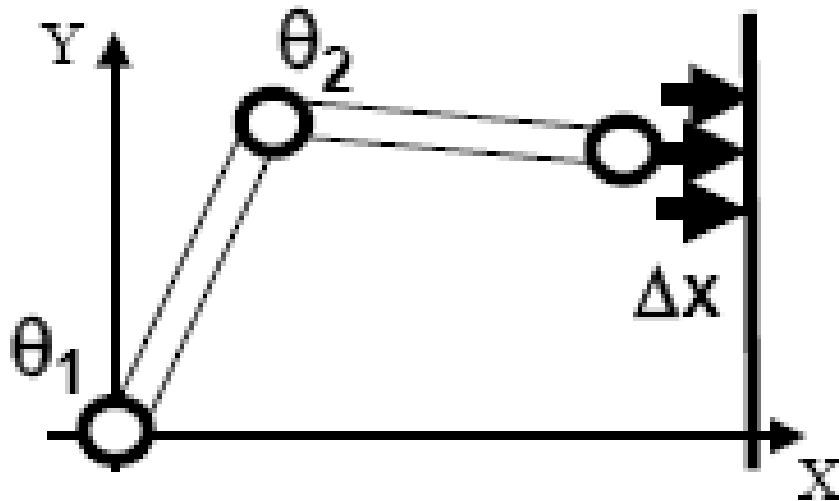


[Images from Retargetting Motion to New Characters, Gleicher, Siggraph98]

- Need to find a position with hands on the box and feet in concordance with skeleton morphology
 - Feet crossing the floor
 - **Foot sliding**
- Quick overview of inverse kinematic

Inverse Kinematics

- Inverse Kinematics
 - Given effectors positions, find a posture(=angles)
- Non-linear problem (position vs. angles)
 - Possibility of no or multiple solutions



Forward Kinematics

- The forward kinematic function $f()$ computes the world space end effector DOFs from the joint DOFs:
 - Forward kinematic is often easy to compute

$$\mathbf{e} = f(\Phi)$$

Inverse Kinematics

- The goal of inverse kinematics is to compute the vector of joint DOFs that will cause the end effector to reach some desired goal state
- In other words, it is the inverse of the forward kinematics problem
 - $f^{-1}()$ usually isn't easy to compute

$$\Phi = f^{-1}(\mathbf{e})$$

Inverse Kinematics

Inverse Kinematics: many approaches

- Analytic method [IKAN, Badler]
 - Geometric based, fast
 - Ok only for few joints
- Numeric solution
 - Iterative process
 - Expensive
 - Flexible (constraints)
 - Minimization problem

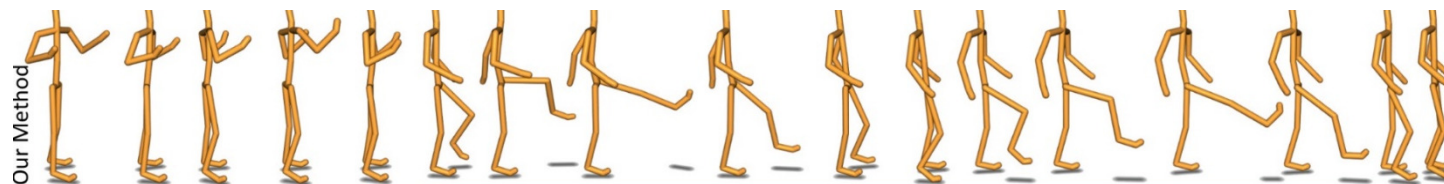


Editing One Pose

See the course on IK

MOTION EDITING

Input: 1 animation



The General Challenge

What you get is not what you want!

- You get observations of the performance
 - A specific performer
 - A real human
 - Doing whatever they did
 - With the noise and “realism” of real sensors
- Want something else
 - But need to preserve original
 - But we don't know what to preserve
 - Can't characterize motion well enough

Three Problems

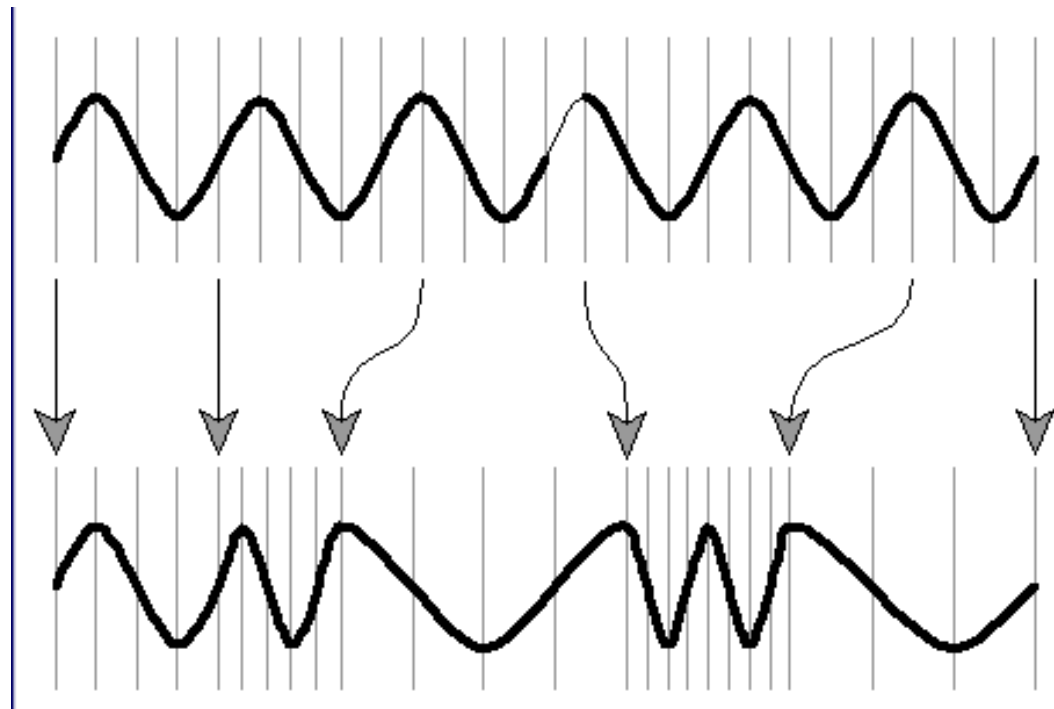
- Where does X live in the data?
 - Where $X \in \{\text{style, personality, emotion, ...}\}$
 - The things to keep or add
- Small artifacts can destroy realism
 - Eye is sensitive to certain details
- How to *specify what you want* ?



Manipulating motion

- Manipulate time: Motion slower or faster
 - $m(t) = m_0(f(t))$
 - $f : \mathbb{R} \rightarrow \mathbb{R}$ “time warp”
- Time scaling
 - $f(t) = k t$
- Time shifting
 - $f(t) = t + k$
- Time warping
 - Interpolate a table
 - Align events

VIDEO

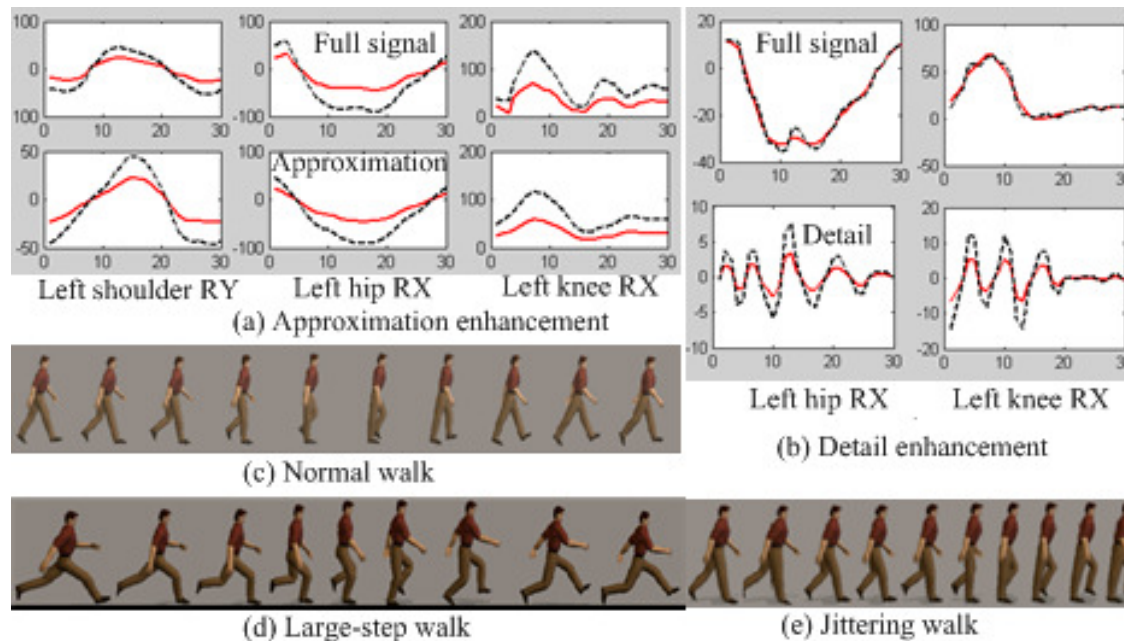


Manipulating motion

- Manipulate value
 - $m(t) = f(m_0(t))$
 - $f : \mathbb{R}^n \rightarrow \mathbb{R}^n$
- Scale?
 - For instance each angles $\times 2 \rightarrow$ Exaggerate motion
 - Shift?
 - Convolve (linear filter)
- “Add” to another motion
 - $m(t) = m_0(t) + a(t)$

Noise Removal: Signal Processing

- Noise comes from errors in process
 - Sensor errors
 - Fitting errors
 - Bad movements
- Noise is “data” that we don’t want

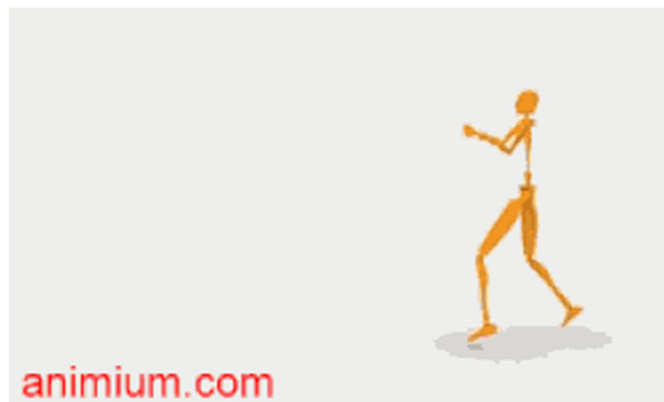


Where's the Noise?

- Sometimes identification is easy
 - Clearly wrong (foot through floor)
 - Marked wrong (missing data - gaps)
 - More often, need to guess
 - Might be a subtle twitch...
 - Might be person shaking...
 - Might be sensor errors...
- simply apply a filter ?

Important Intuition

- High Frequencies are Important!
- Always significant
 - Impact
 - Rapid, sudden movement
 - ...



Signal processing [Unuma95]

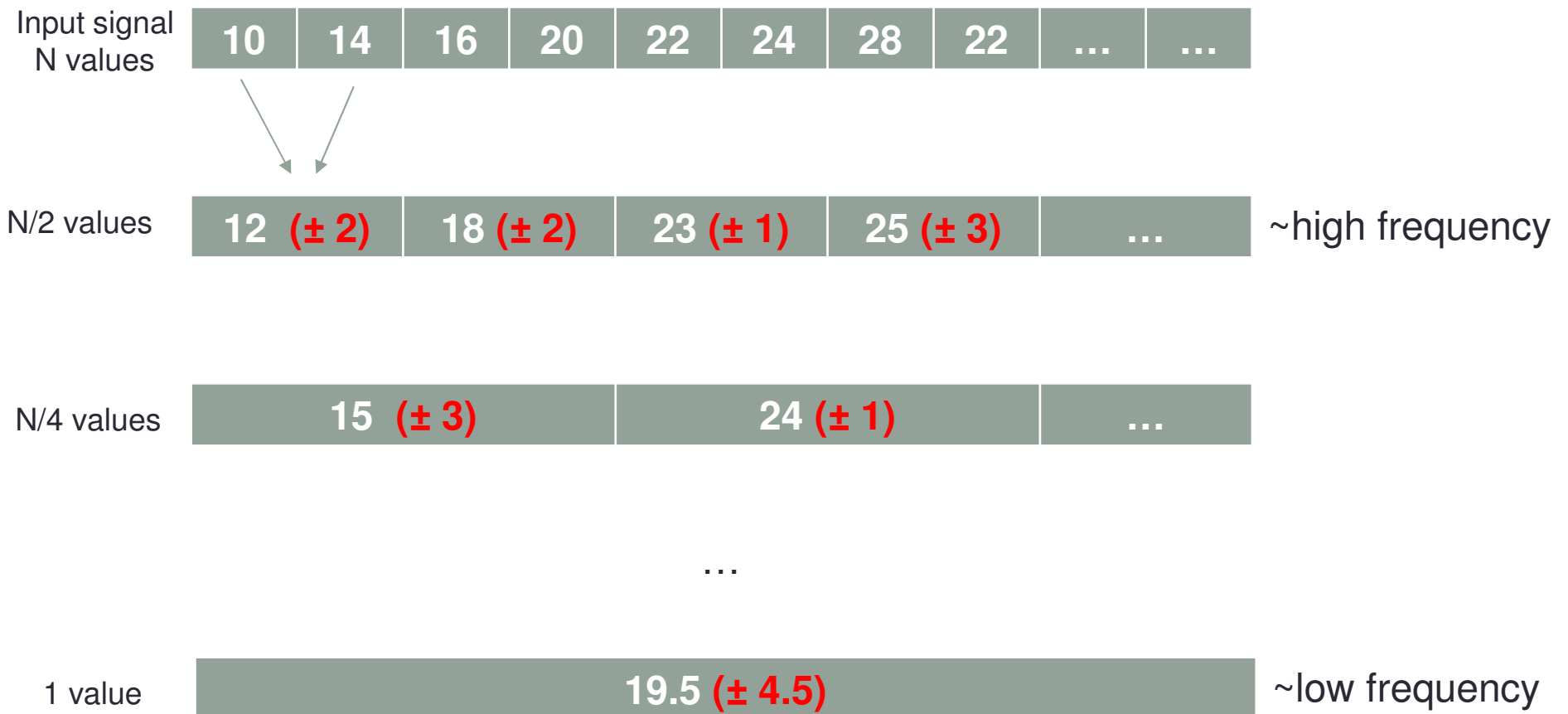
- Fourier series
 - Coefficient motion parameters (emotion, gait)



Exaggerate jump by scaling low frequency

Motion Signal Processing [Bruderlin95]

- Foreach channel of each joint



G = white values; L=red values

Motion Signal Processing [Bruderlin95]

- G : (left) white value of previous slide
- L : (right) red value of previous slide

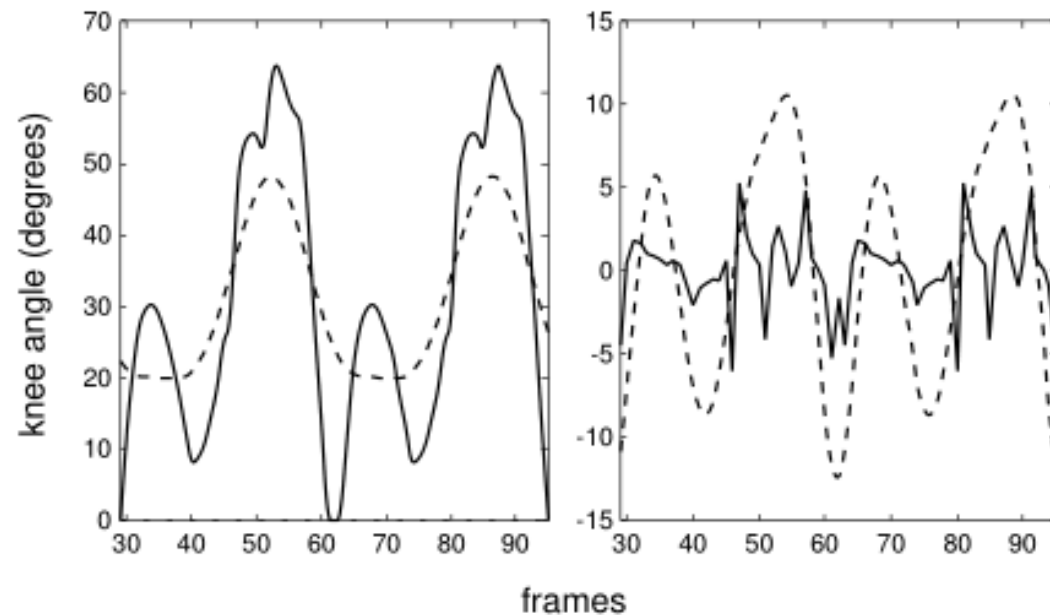
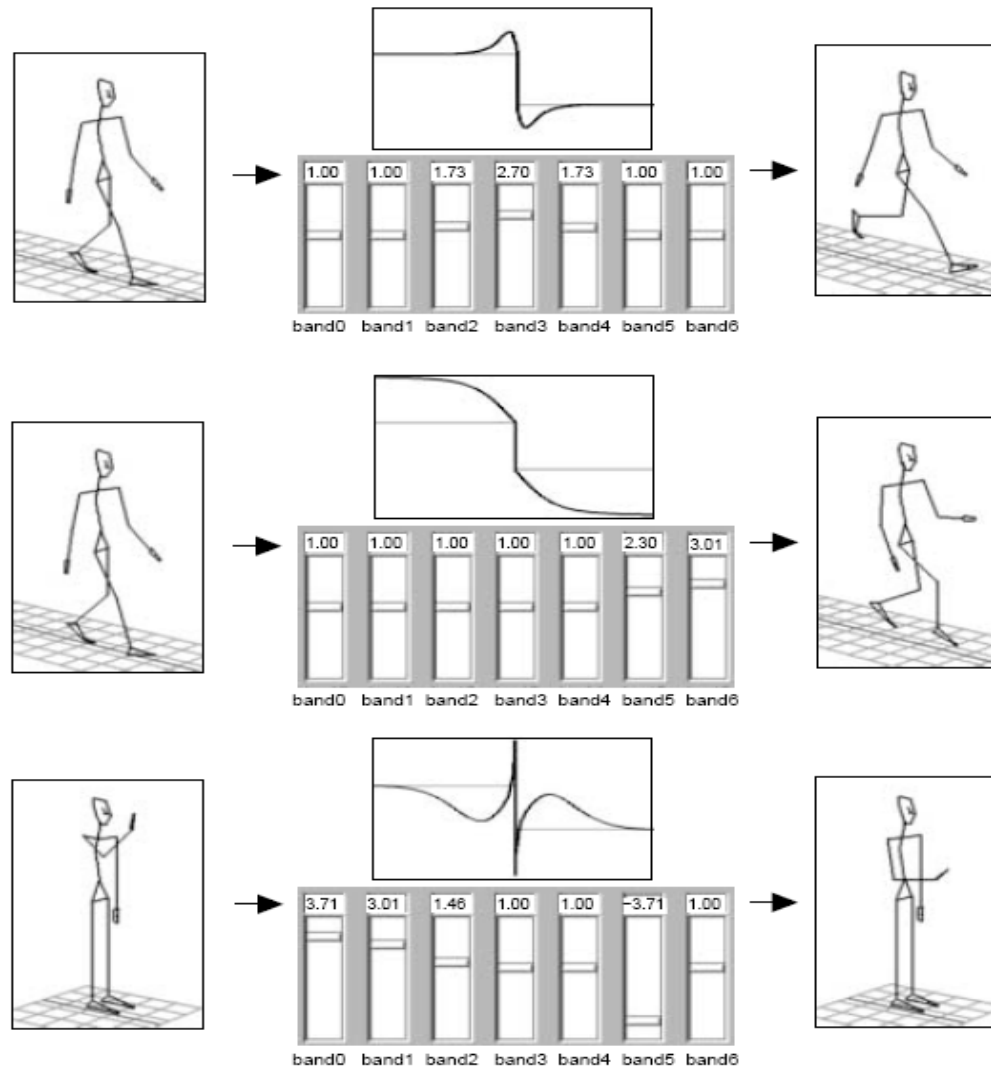


Figure 2: Left: lowpass G_0 (solid) and G_3 (dashed; B-spline kernel of width 5); right: bandpass L_0 (solid) and L_2 (dashed) of the sagittal knee angle for two walking cycles.

Motion Signal Processing [Bruderlin95]

Siggraph95



Signal processing and style [YM2016]

- Yumer M.E. and Mitra N.J., Spectral Style Transfer for Human Motion btw. Independent Actions, SIGGRAPH 2016.

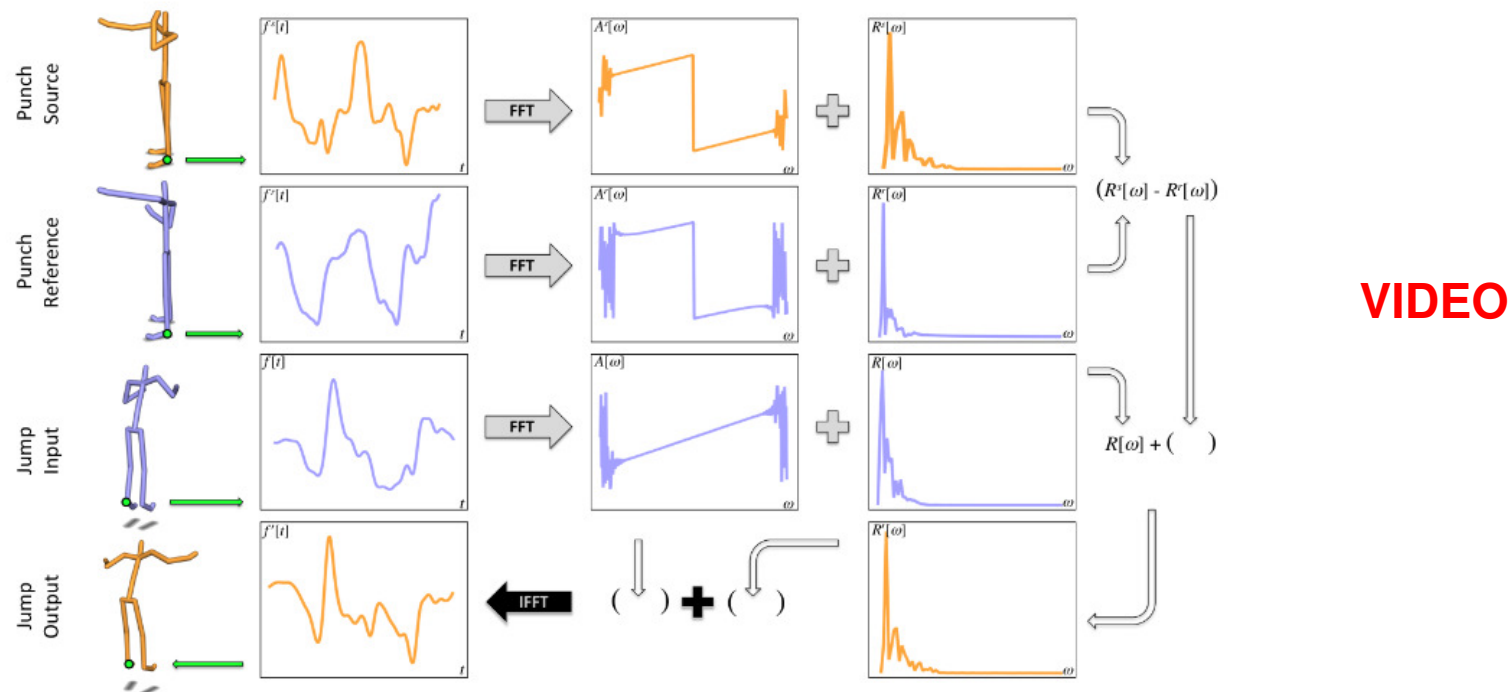


Figure 4: Time domain signals: target $f[t]$, source $f^s[t]$, and reference $f^r[t]$. Spectral domain processing: we keep $A[\omega]$ constant, and apply the difference of $R^s[\omega]$ and $R^r[\omega]$ to $R[\omega]$ under real-only time-domain signal constraint to compute $R^o[\omega]$. Stylized magnitude $R^o[\omega]$ and constant $A[\omega]$ result in the stylized time domain data.

MOTION EDITING

Transition between 2 Animations

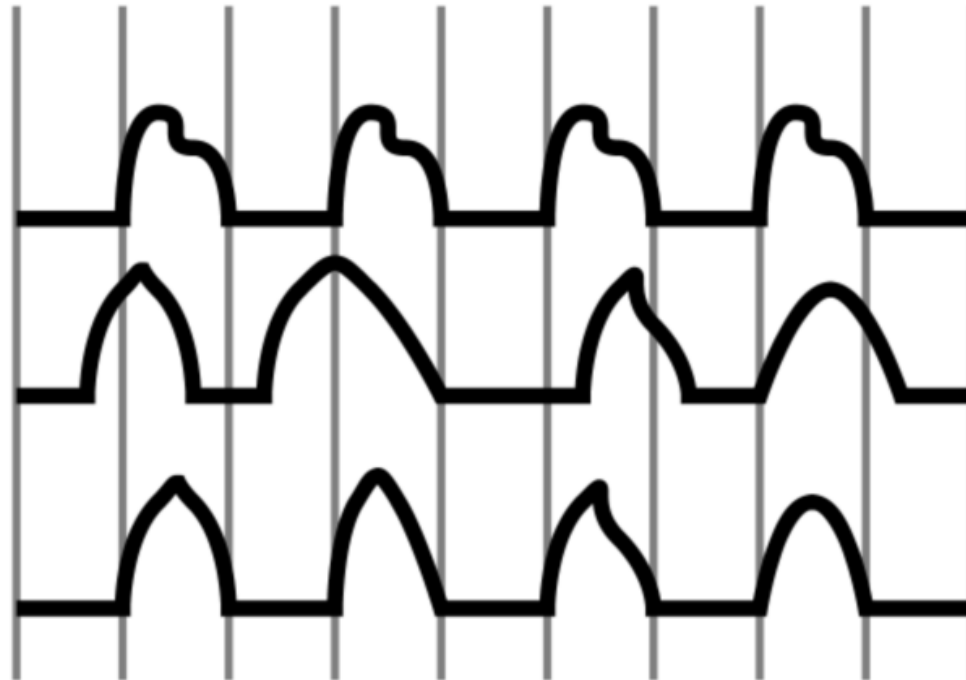


Motion Blending (interpolation)

- “Add” two motions together
 - Really interpolate
- $m(t) = a m_0(t) + (1-a) m_1(t)$
 - Note: this is a per-frame operation
- It works only if poses are similar!!!
- Very useful!
 - Often get small pieces of motion
 - Need to connect
 - Easy if motions are similar

Motion Blending

- “Add” or “blend” two motions together
 - Works only if motion are synchronized



Motion Blending

Anim 1

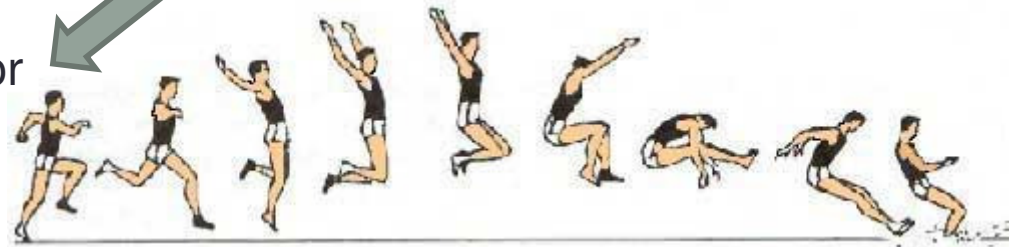


Right leg on the floor

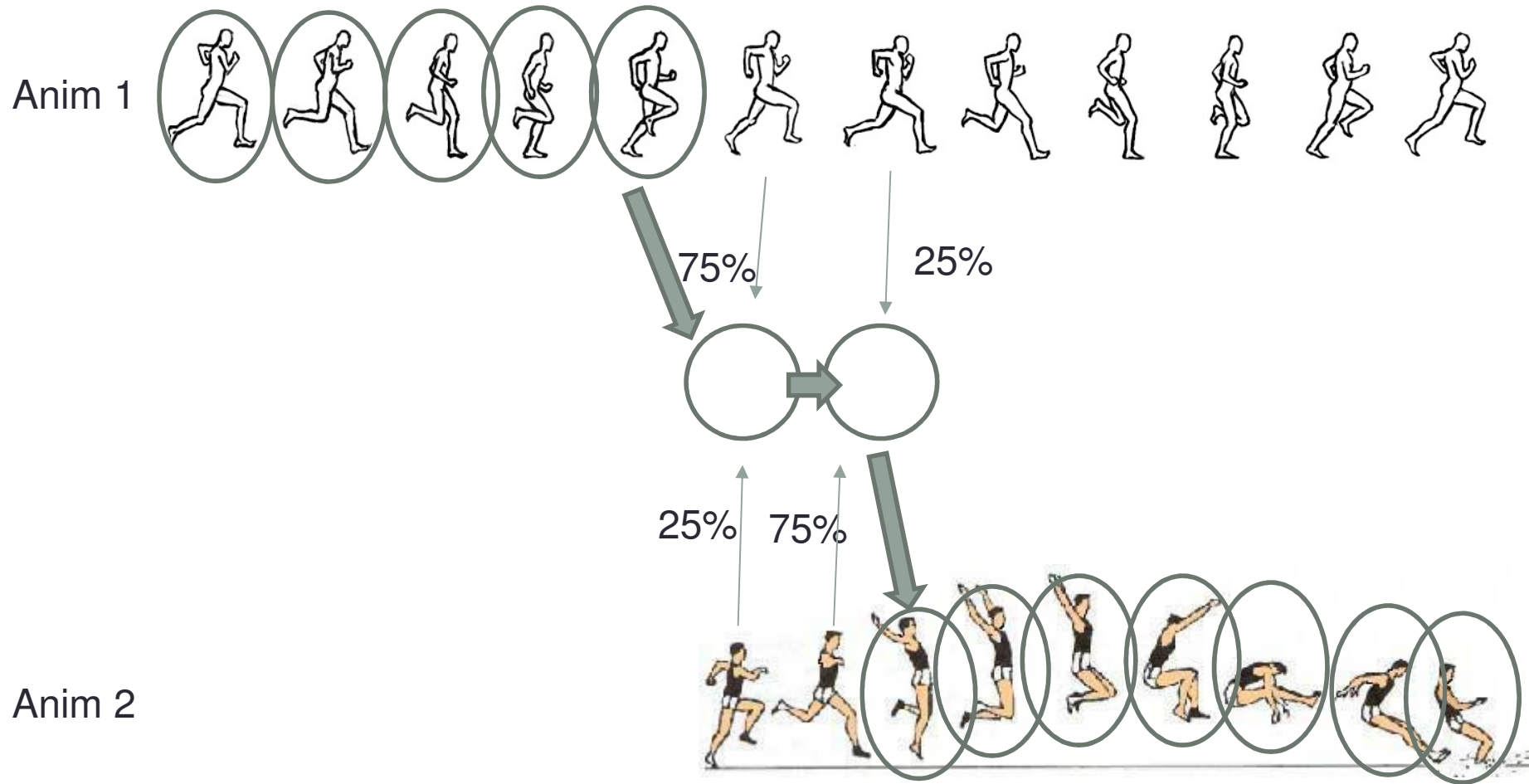
Bad transition

Left leg on the floor

Anim 2



Motion Blending : good transition

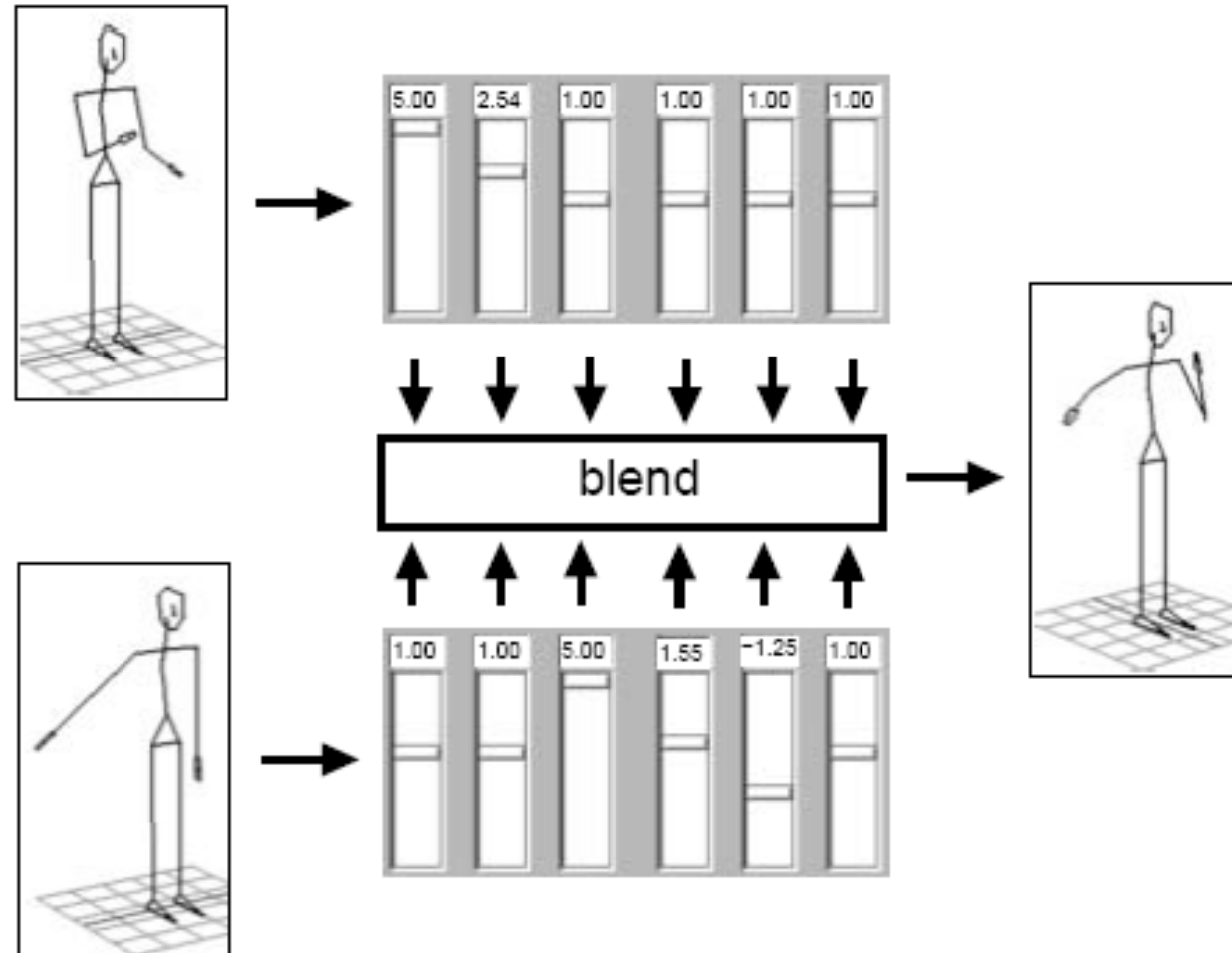


Motion Blending using Signal Processing

[Bruderlin95]

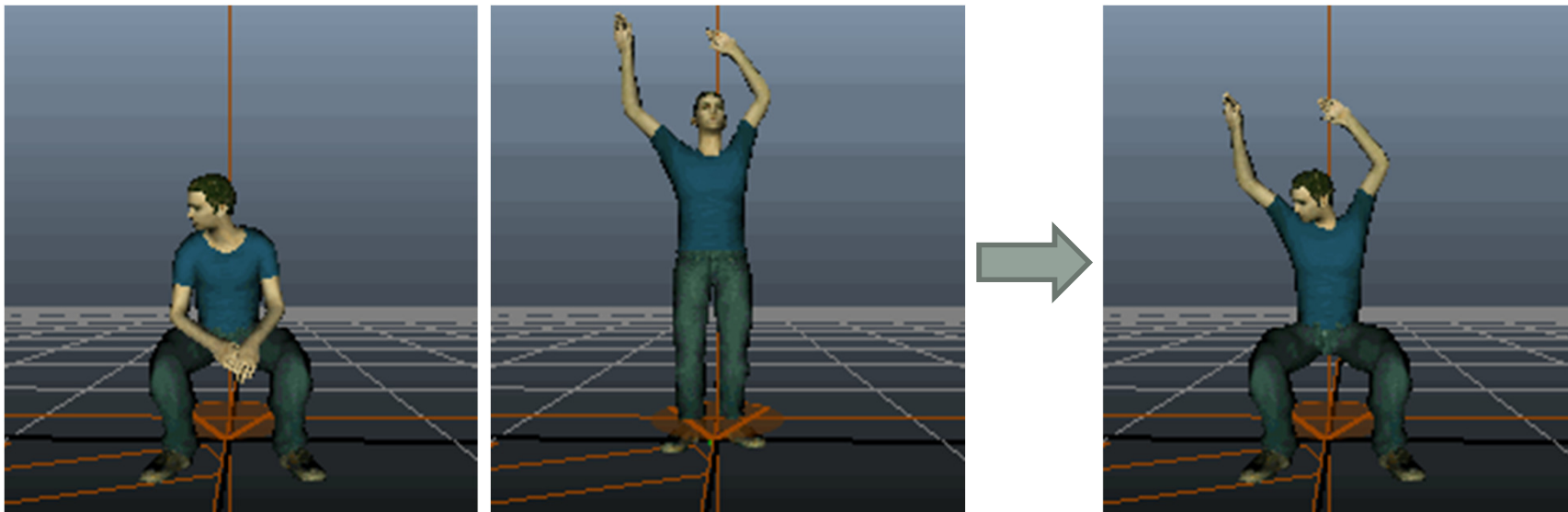
Siggraph95

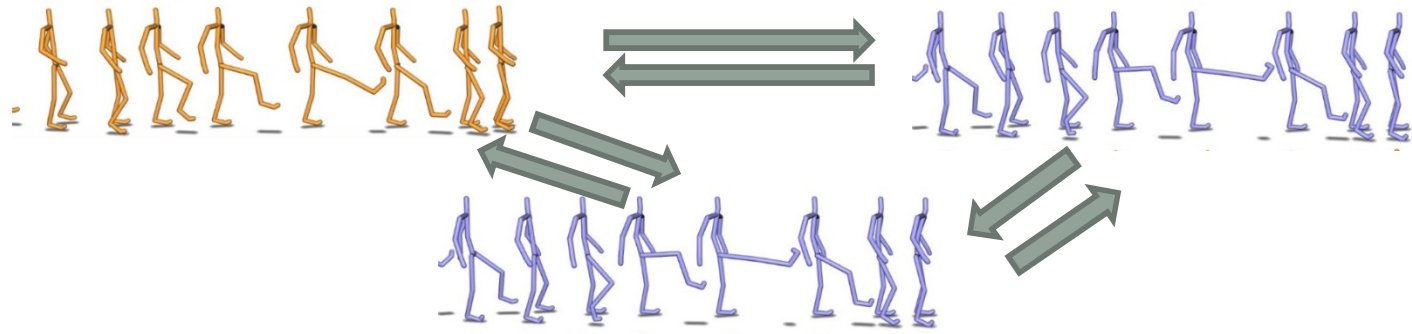
Motion Blending



Motion Blend by Body Parts

- Combine different motions for each body parts





MOTION EDITING

Input : set of N animations

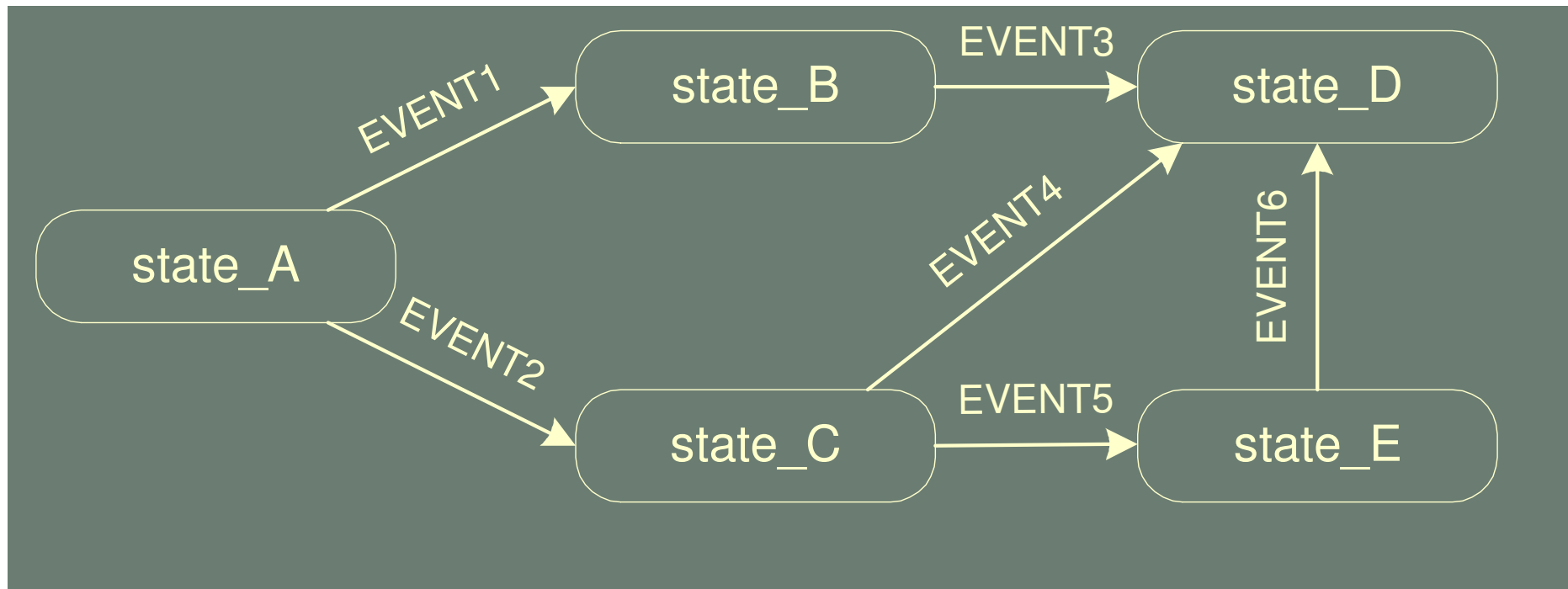
→ Character Control with

- Finite State Machine
- Motion Graph

Finite State Machines

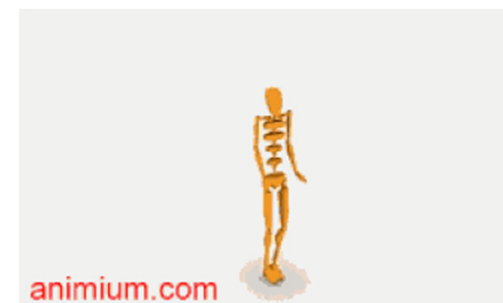
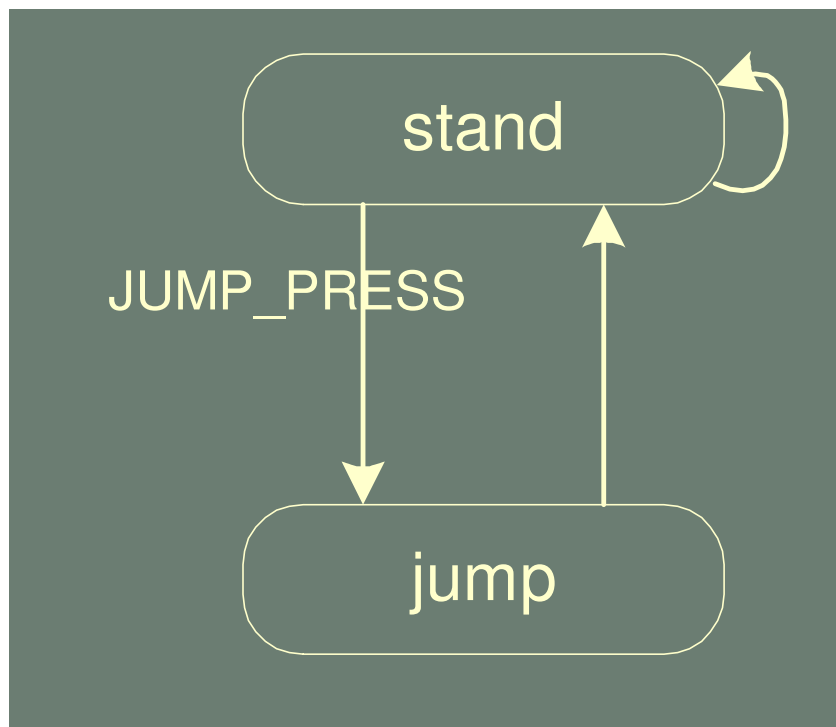
- States represent animations
- Transitions represent instantaneous events
- Transitions can be triggered by
 - End of animation
 - Button press
 - In-game event (collision...)
 - Timers
 - Whatever...
- State machines can be blended. Blenders can be controlled by state machines...

State Machines

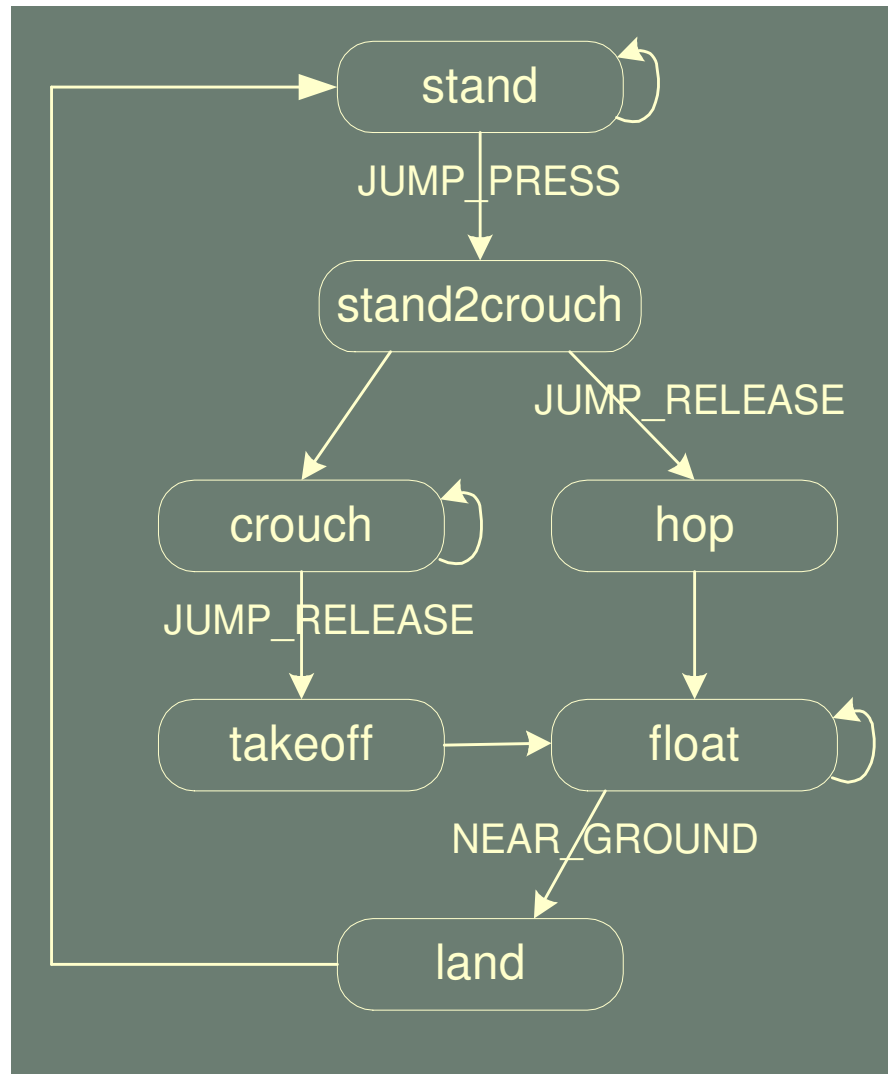


Simple Jump State Machine

- Consider a simple state machine where a character jumps upon receiving a JUMP_PRESS message



More Complex Jump



State Machine (Text Version)

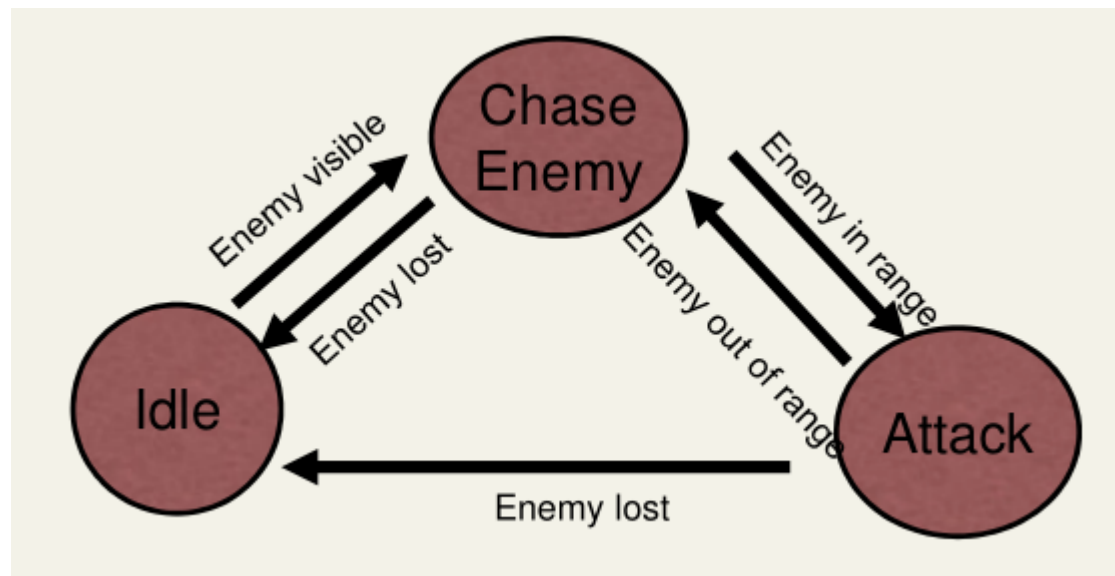
| STATE | EVENT | ACTION |
|----------------|---------------|----------------|
| stand | {JUMP_PRESS | stand2crouch } |
| stand2crouch { | JUMP_RELEASE | hop |
| | END | crouch } |
| crouch | {JUMP_RELEASE | takeoff } |
| takeoff | {END | float } |
| hop | {END | float } |
| float | {NEAR_GROUND | land } |
| land | {END | stand } |

State Machines and IA

- FSM → Behaviour → Play Motion Capture Animation

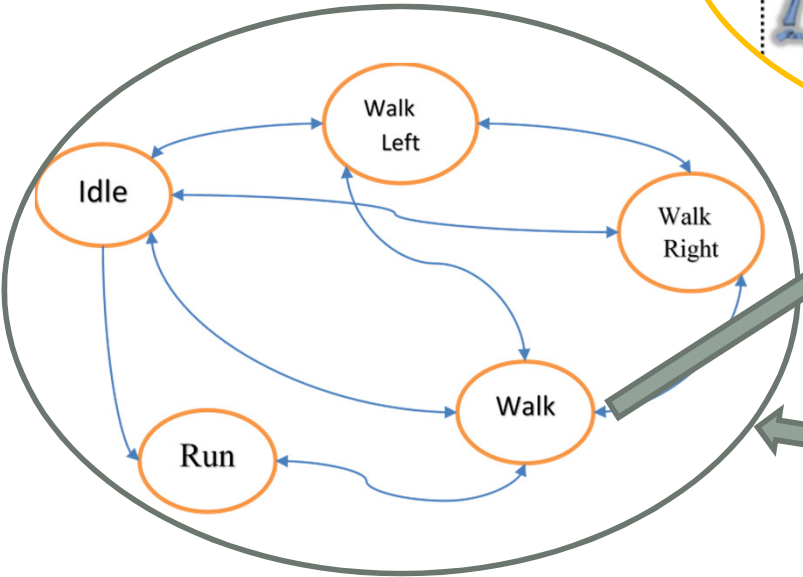
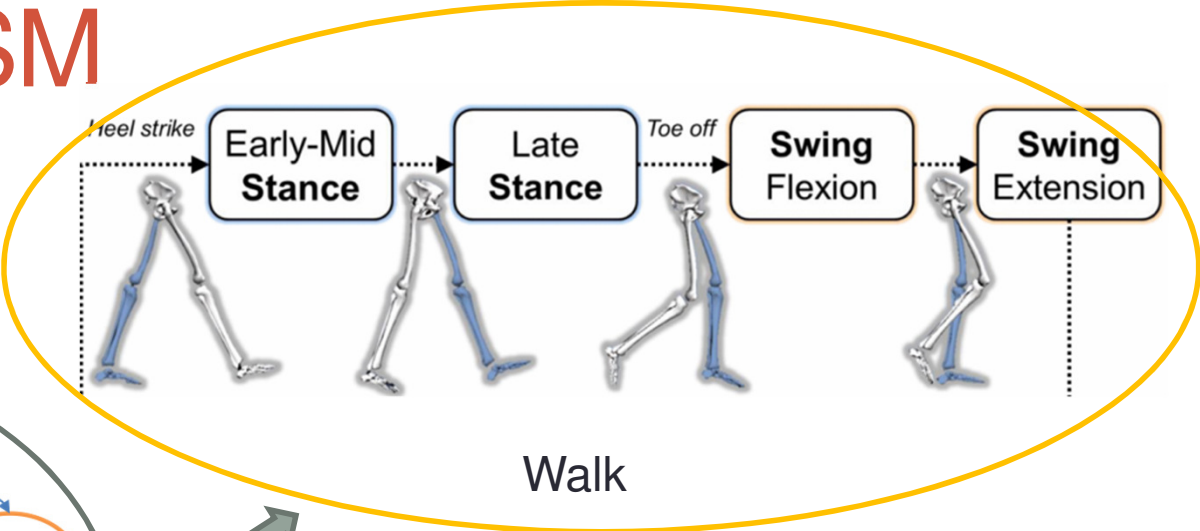


- First person shooter example

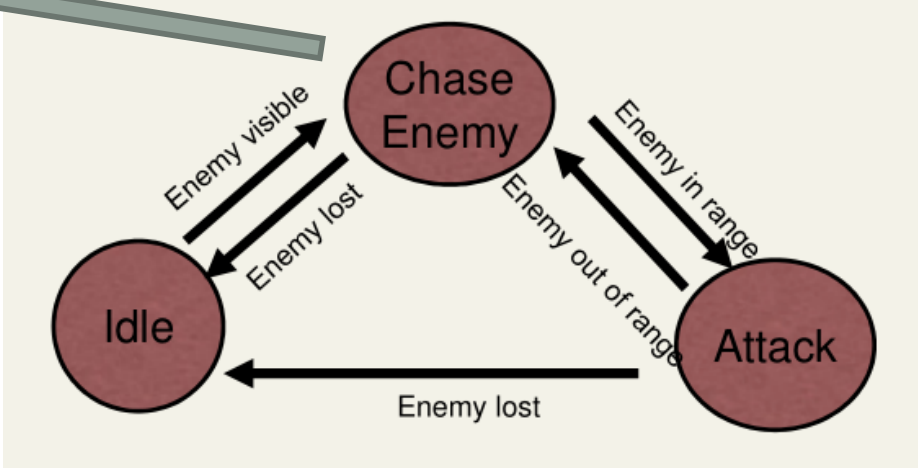


Hierarchical FSM

Computer Animation



Chase Enemy

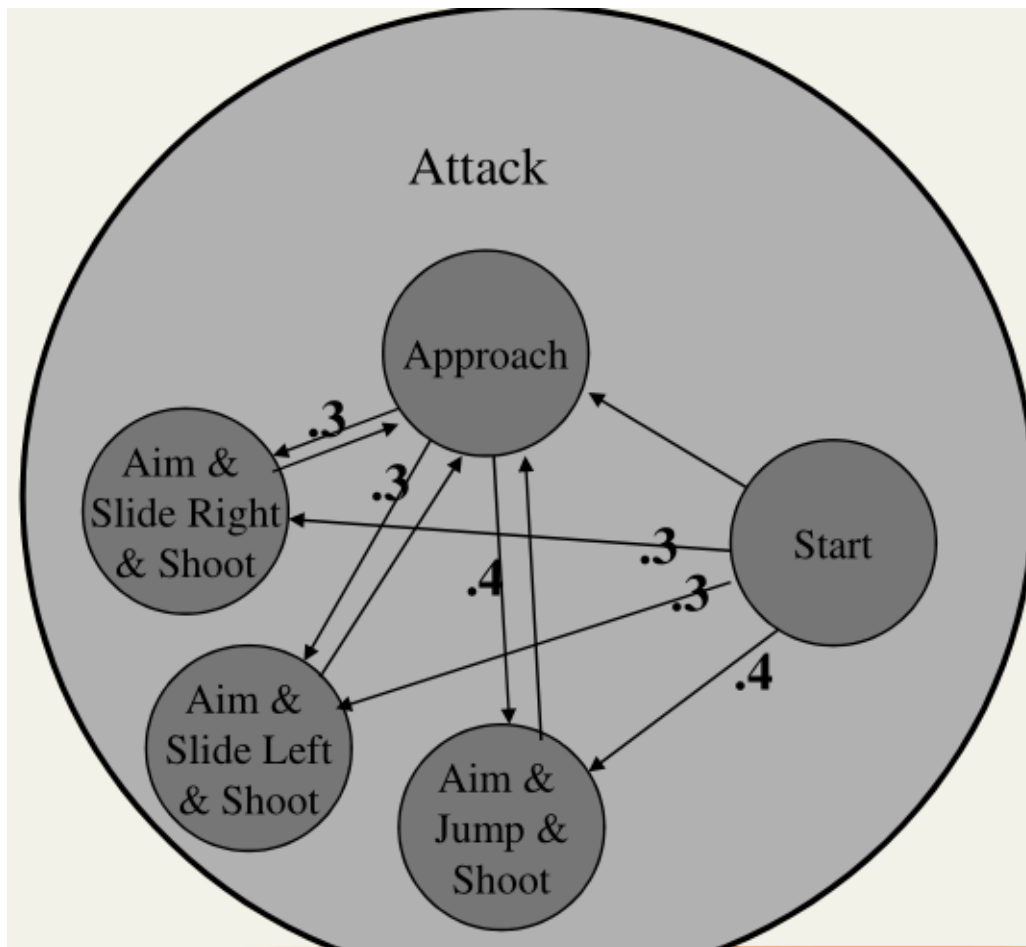


IA

zoom

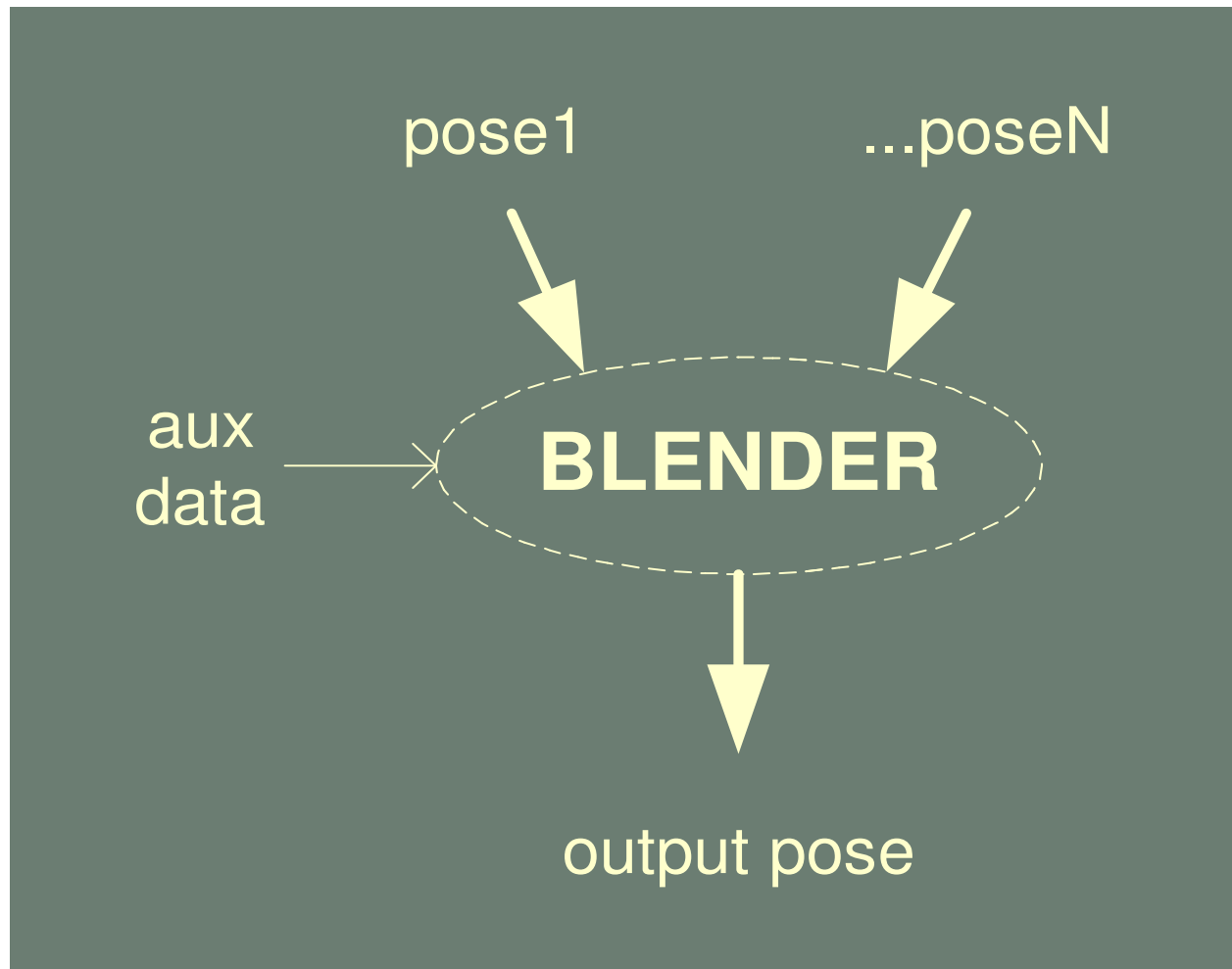
zoom

Non Deterministic Hierarchical FSM



- Adds variety to actions
- Have multiple transitions for the same event
- Label each with a probability that it will be taken
- Randomly choose a transition at run-time
- Markov Model: New state only depends on the previous state

Need Generic Blend Operation

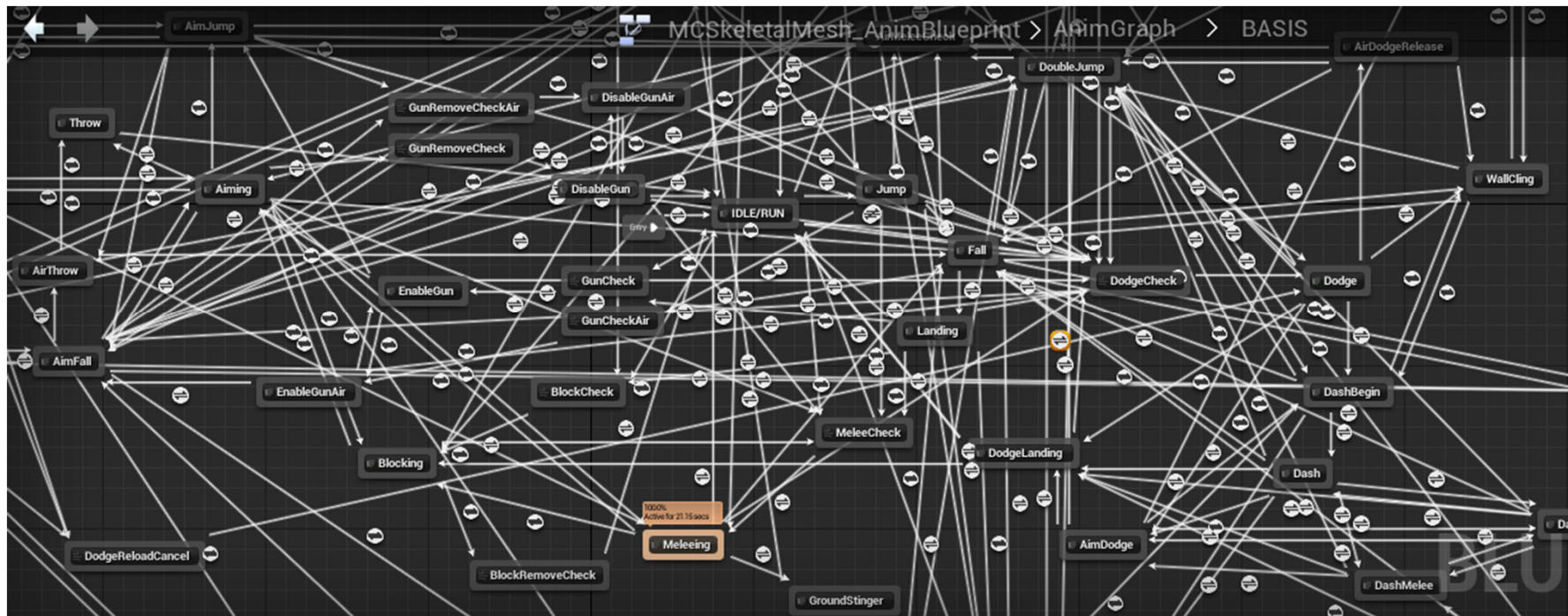


Cf. Quaternion + interpolation

Advantage of FSM 😊

- Very fast – one array access
- Expressive enough for simple behaviors or characters that are intended to be “dumb”
- Can be compiled into compact data structure
 - Dynamic memory: current state
 - Static memory: state diagram – array implementation
- Can create tools so non-programmer can build behavior
- Non-deterministic FSM can make behavior unpredictable

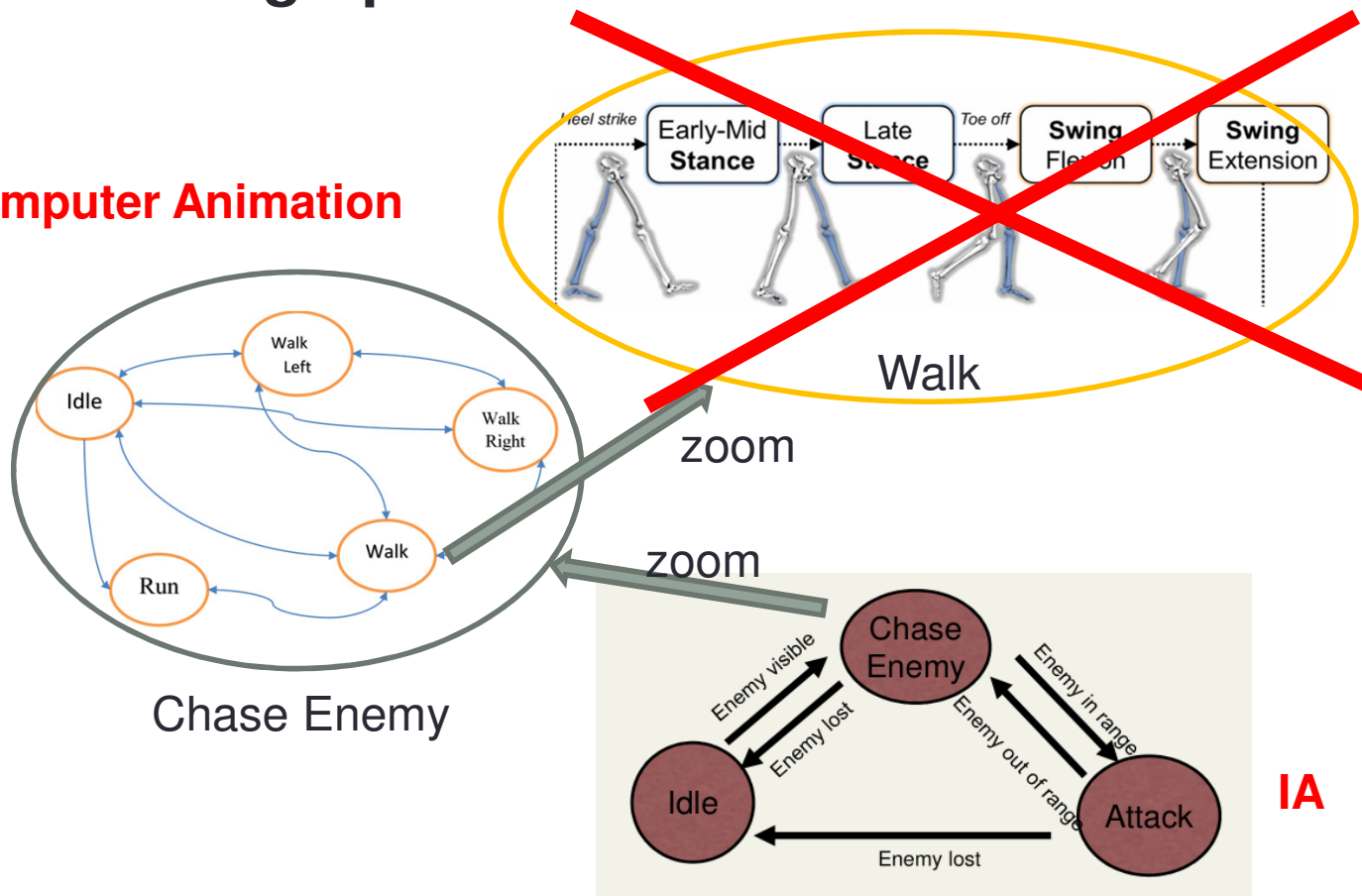
Spaghetti State Machines ☹️



Motion Graph [Kovar, Gleicher, Pighin '02]

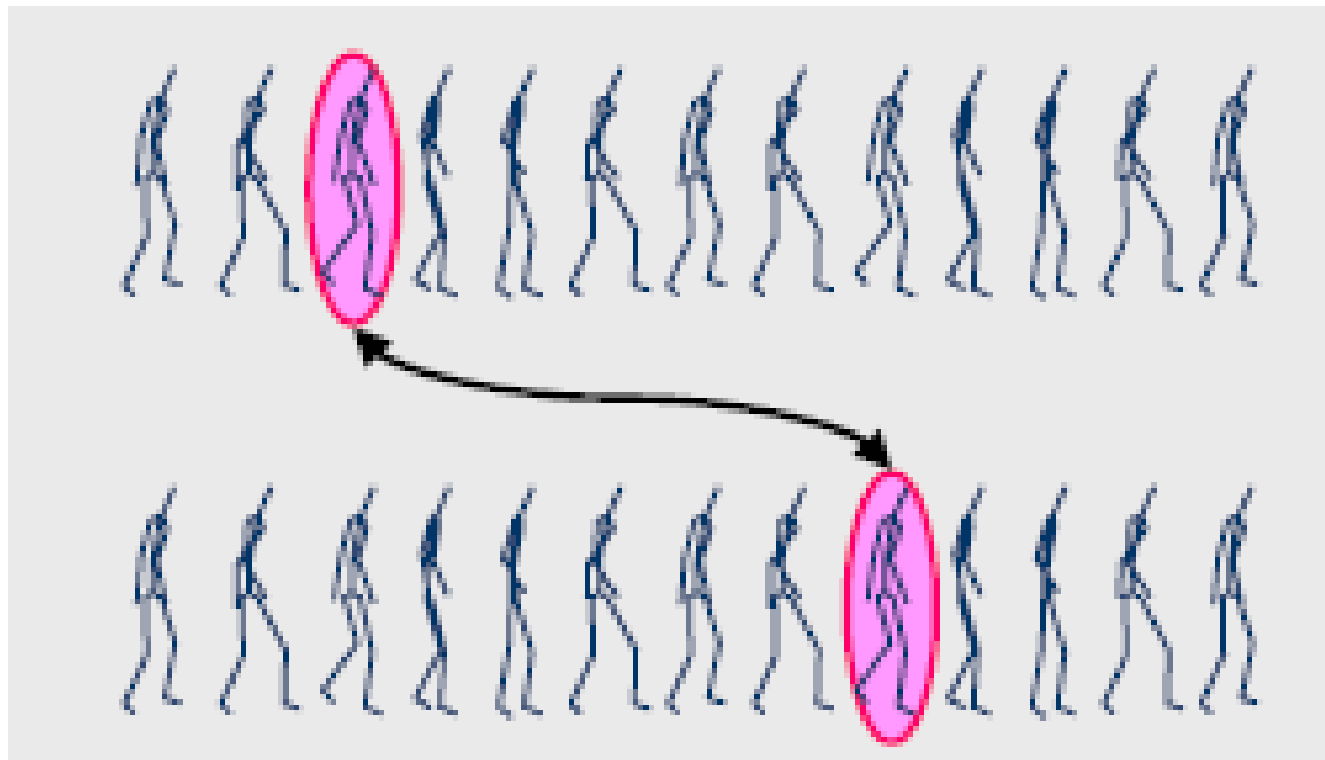
Replace FSM for animation part by an automatically generated graph

Computer Animation



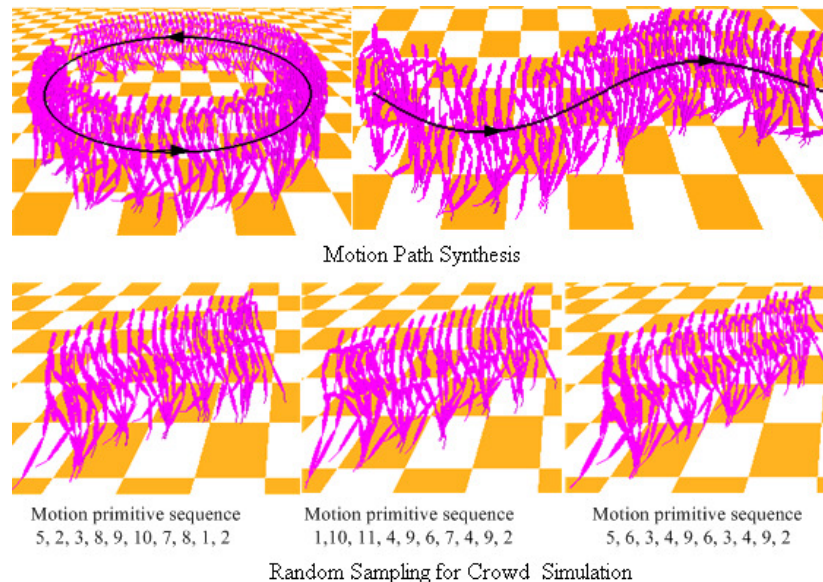
Idea: Motion Graph

Find Automatically Matching States in Motions



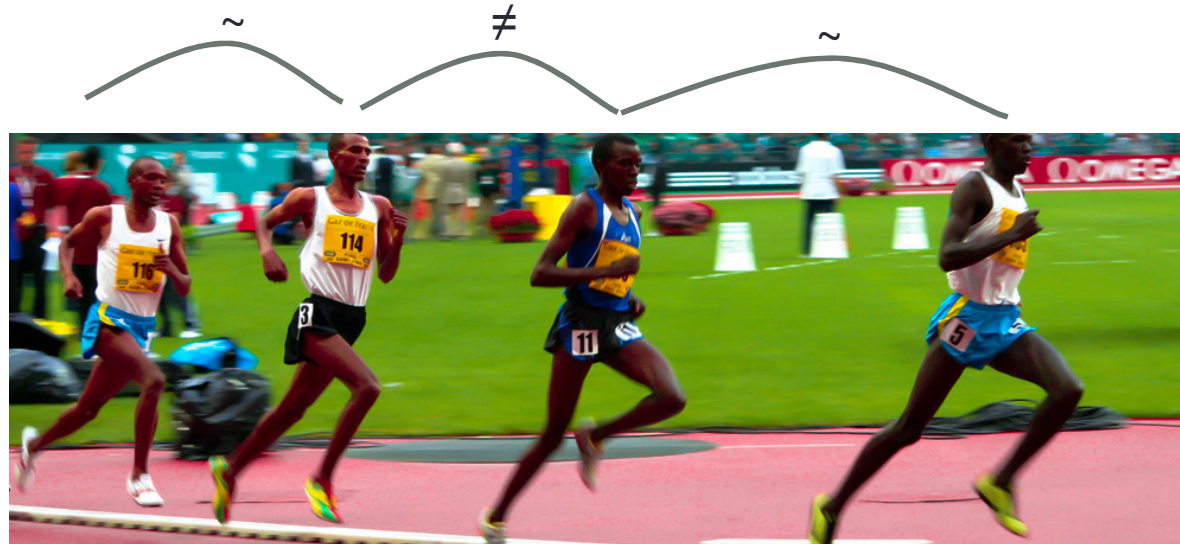
Idea: Put Clips Together

- New motions from pieces of old ones!
- Good news:
 - Keeps the qualities of the original (with care)
 - Can create long and novel “streams” (keep putting clips together)
- Challenges:
 - How to decide what clips to connect?
 - How to connect clips?



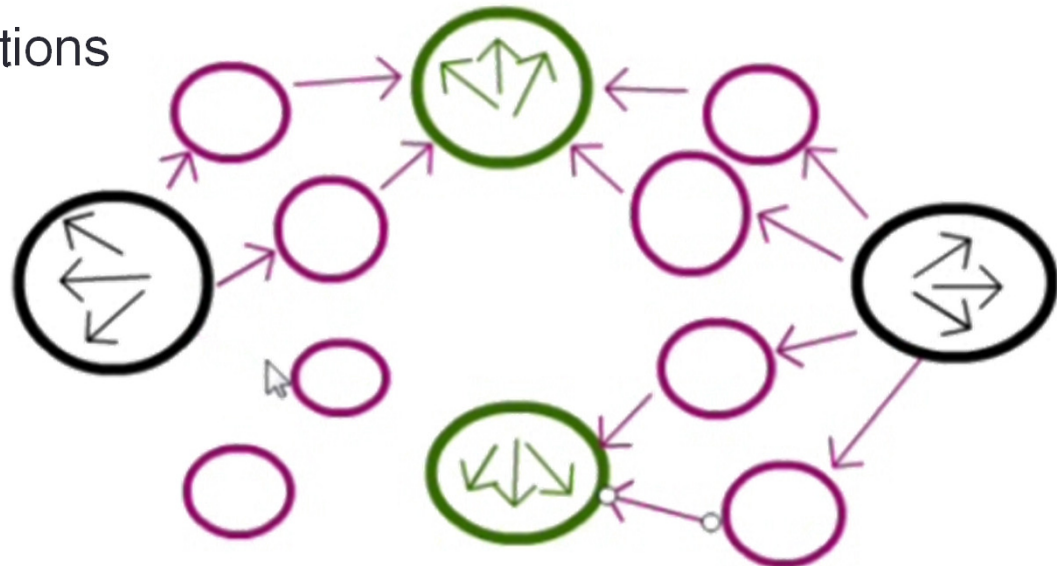
Connecting Clips: Transition Generation

- Transitions between motions can be hard
- Motion interpolation works *sometimes*
 - Blends between aligned motions
 - Cleanup footskate artifacts
- Just need to know when is “sometime”
 - Need a distance between pose



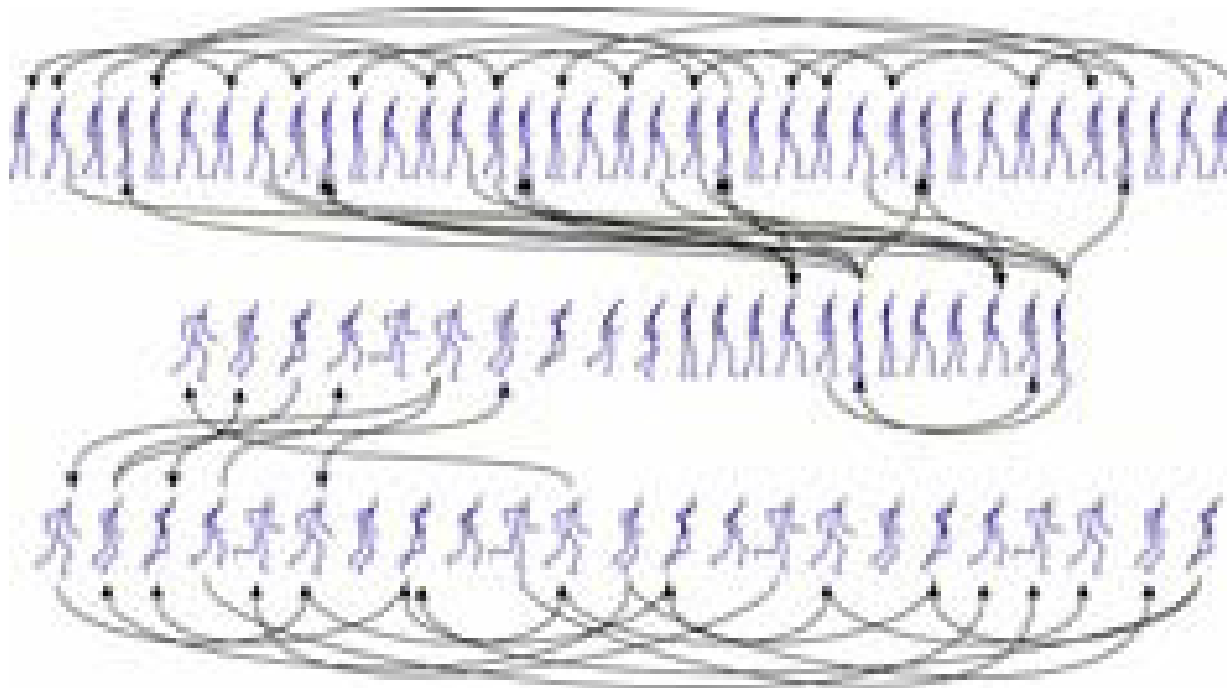
What are motion graphs?

- Directed graph representing a roadmap of motion data for a character
 - Vertex represent a pose in a motion clip
 - Vertex=(motion clip name, pose number)
 - Edges are pose transitions



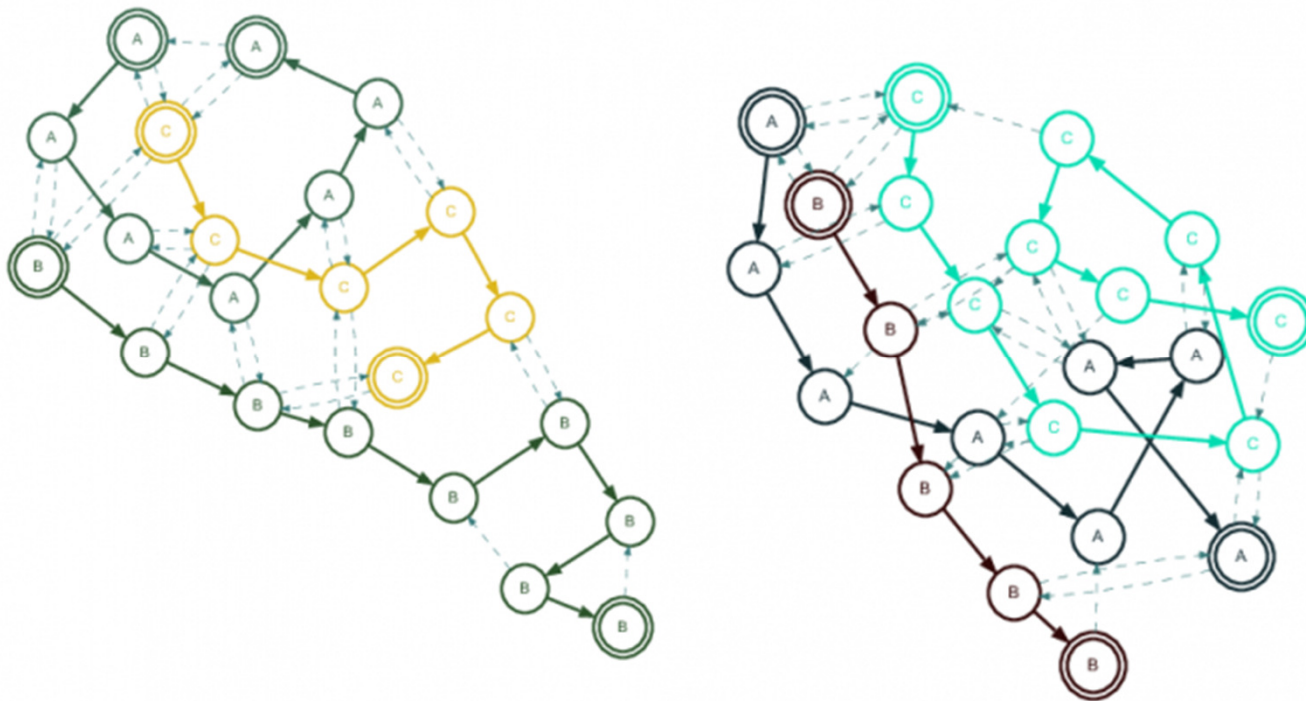
A simple motion graph

- Vertex represent a pose in a motion clip
=(motion clip name, pose number)
- Edges are pose transitions



A simple motion graph

- Motion Blend & Motion Graph
 - Motion Graph more examples





Building motion graphs

- Identify transition candidates
- Select transition points
- Eliminate problematic edges

Identify transition candidates: pose distance

- For each pose A of clip C_j , calculate its distance to each other pose B of all other clip by basically measuring volume displacement



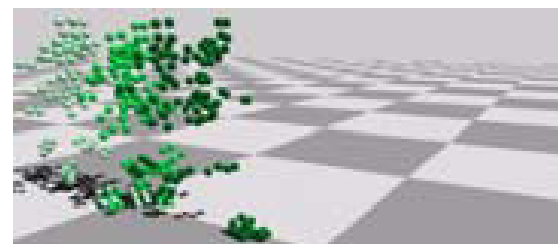
1) Initial frames we want to compare



2) Extract windows:
frame before and after



3) Convert to point clouds



4) Align point clouds and
sum squared distances

Identify transition candidates: pose distance

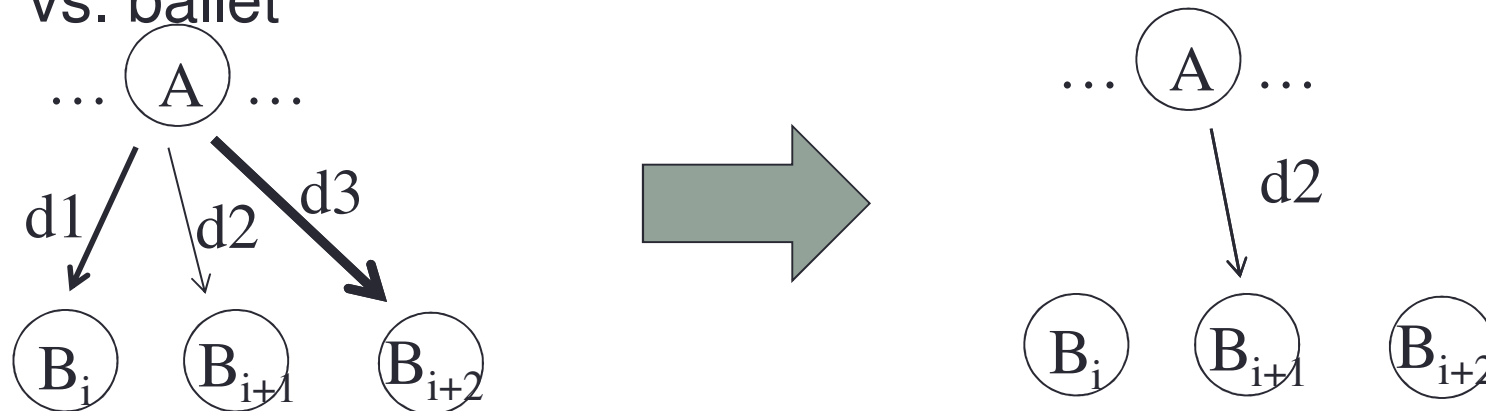
- For each frame/pose A, calculate its distance to each other frame/pose B by basically measuring volume displacement
- Use a weighted point cloud formed over a window of k frames ahead of A and behind B, ideally from the character mesh

$$\min_{\theta, x_0, z_0} \sum_i w_i \| \mathbf{p}_i - \mathbf{T}_{\theta, x_0, z_0} \mathbf{p}'_i \|^2$$

- Calculate the minimal weighted sum of squared distances between corresponding points, given that a rigid 2D transformation may be applied to the second point cloud

Select transition/edge

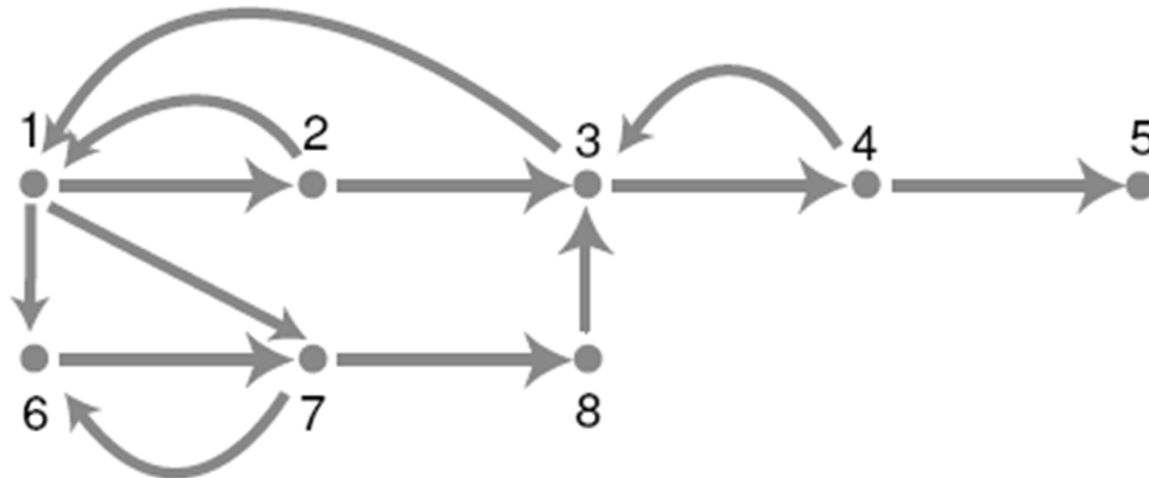
- The previous step gave us all the local minima of the distance function for each pair of points
- Now we simply define a threshold and cut transition candidates with errors above it
- May be done with or without intervention
- Threshold level depends on type of motion – eg. walking vs. ballet



We define transition only between pose with significant similitude

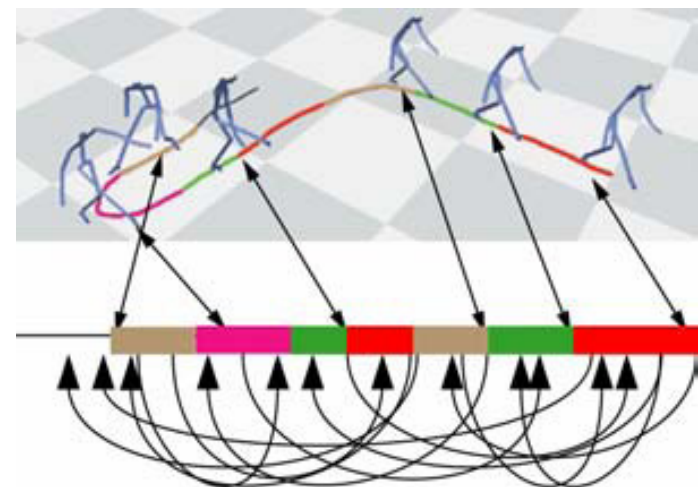
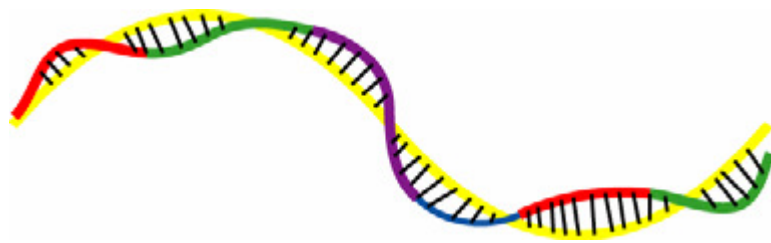
Eliminate problematic edges

- We want to get rid of:
 - Dead ends – not part of a cycle
 - Sinks – part of one or more cycles but only able to reach a small fraction of the nodes
 - Logical discontinuities – eg. boxing motion forced to transition into ballet motion
- Goal is to be able to generate arbitrarily long streams of motion of the same type



Using a motion graph

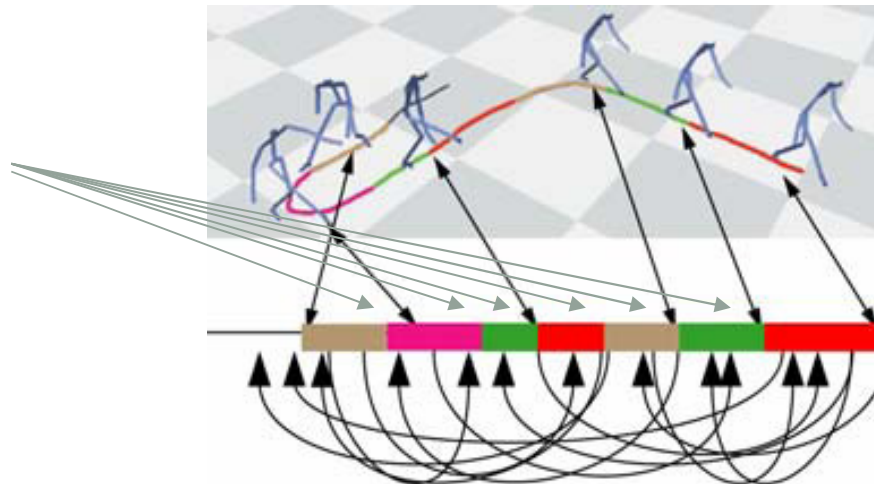
- Any walk on the graph is a valid motion
 - Generate walks to meet goals
 - Random walks (screen savers)
 - Search to meet constraints
- Other Motion Graph- like projects elsewhere
 - Differ in details, and attention to detail



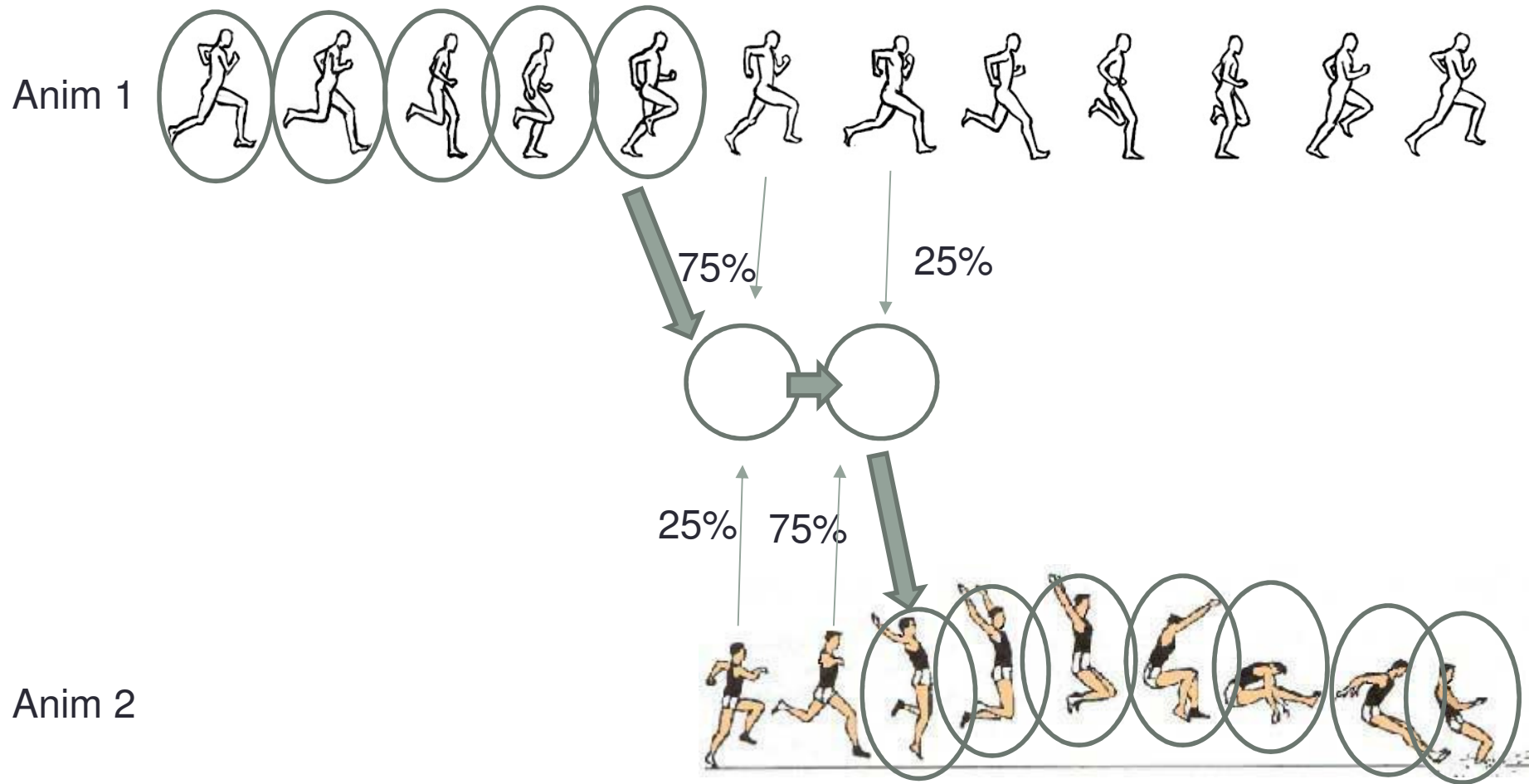
Transitions

- When need to make the transition between frames A_i and B_j blend A_i through A_{i+k-1} with B_j through B_{j-k+1}
 - Align frames with appropriate rigid 2D transformation
 - Use linear interpolation to blend root positions
 - Use spherical linear interpolation to blend joint rotations

Need transition
Cf. Interpolation

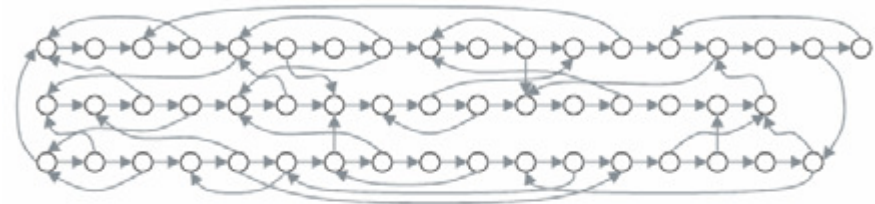
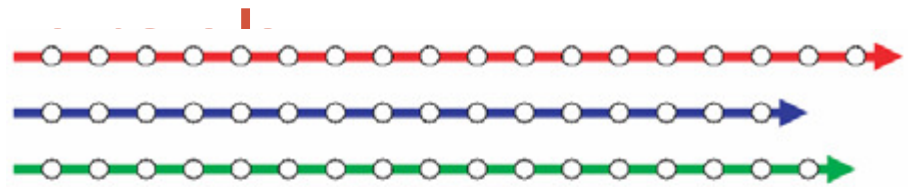


Motion Blending : good transition

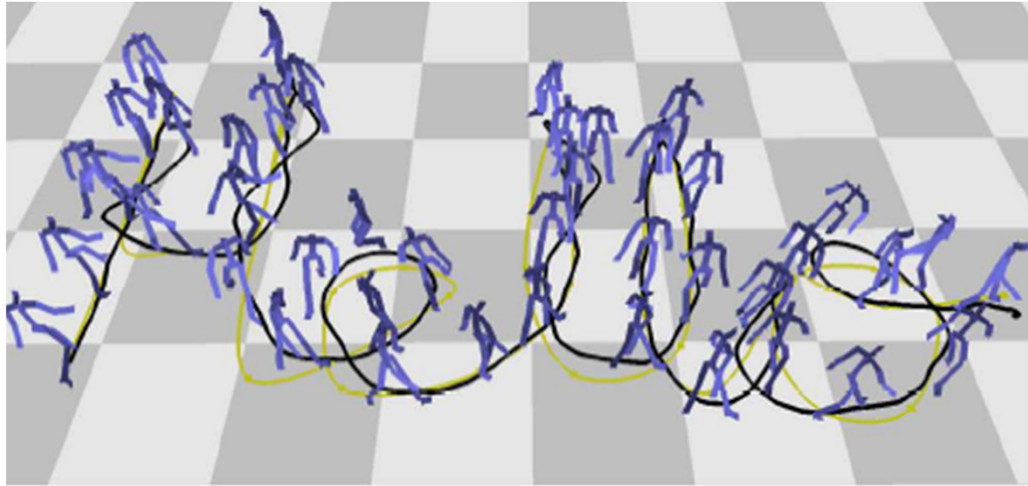


Clustering a motion

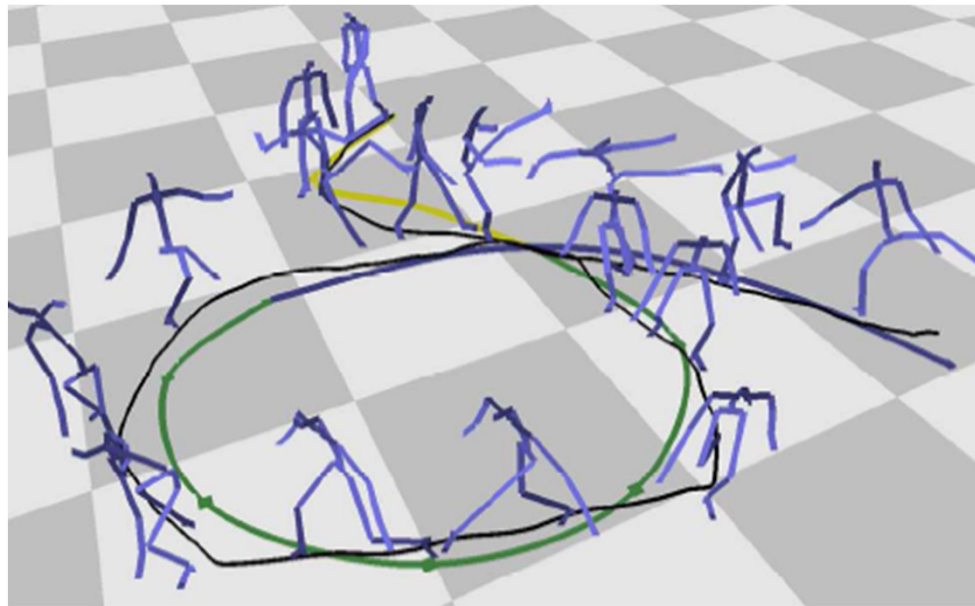
- Clustering the graph
 - For a big graph
 - Build a meta-graph
 - Improve the exploration

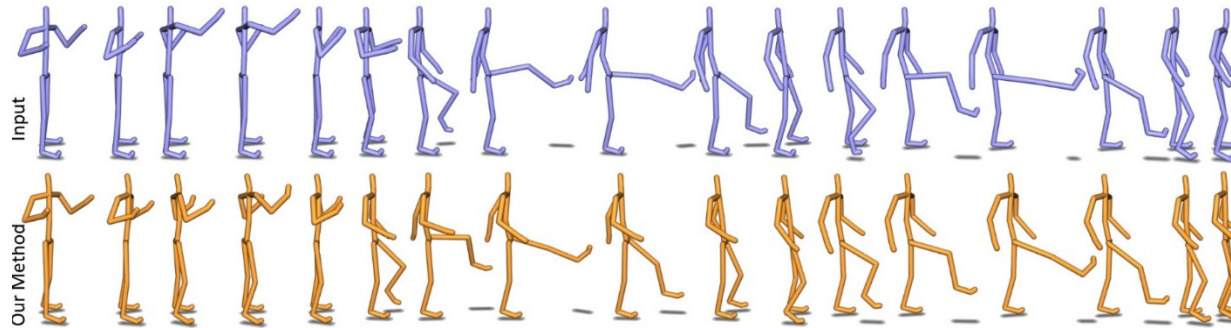


Results



+ video





MOTION EDITING

Input: N animations

Reactivity Problem of Motion Graph

→ Motion Blending between N Animations

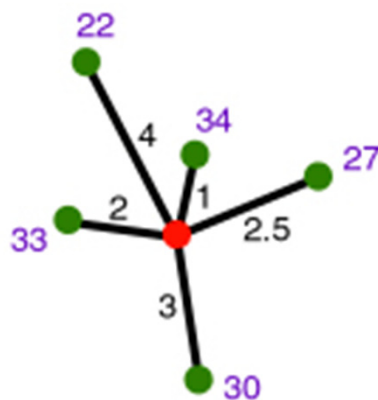
Motion blending

- Often 2 animations not enough to produce realistic moves
- For instance N animations : turn left with different angles
- Interpolating 3 or more angles
 - $\text{angle} = w_0 \times \text{angle}_0 + w_1 \times \text{angle}_1 + w_2 \times \text{angle}_2$
 - avec $\sum w_i = 1$
 - Animations need to be synchronized
- Problem: how to find the weight w_i
 - Inverse distance weighting (See Unity)
 - Barycentric
 - KNN
 - RBF

+VIDEO

Motion blending : barycentric

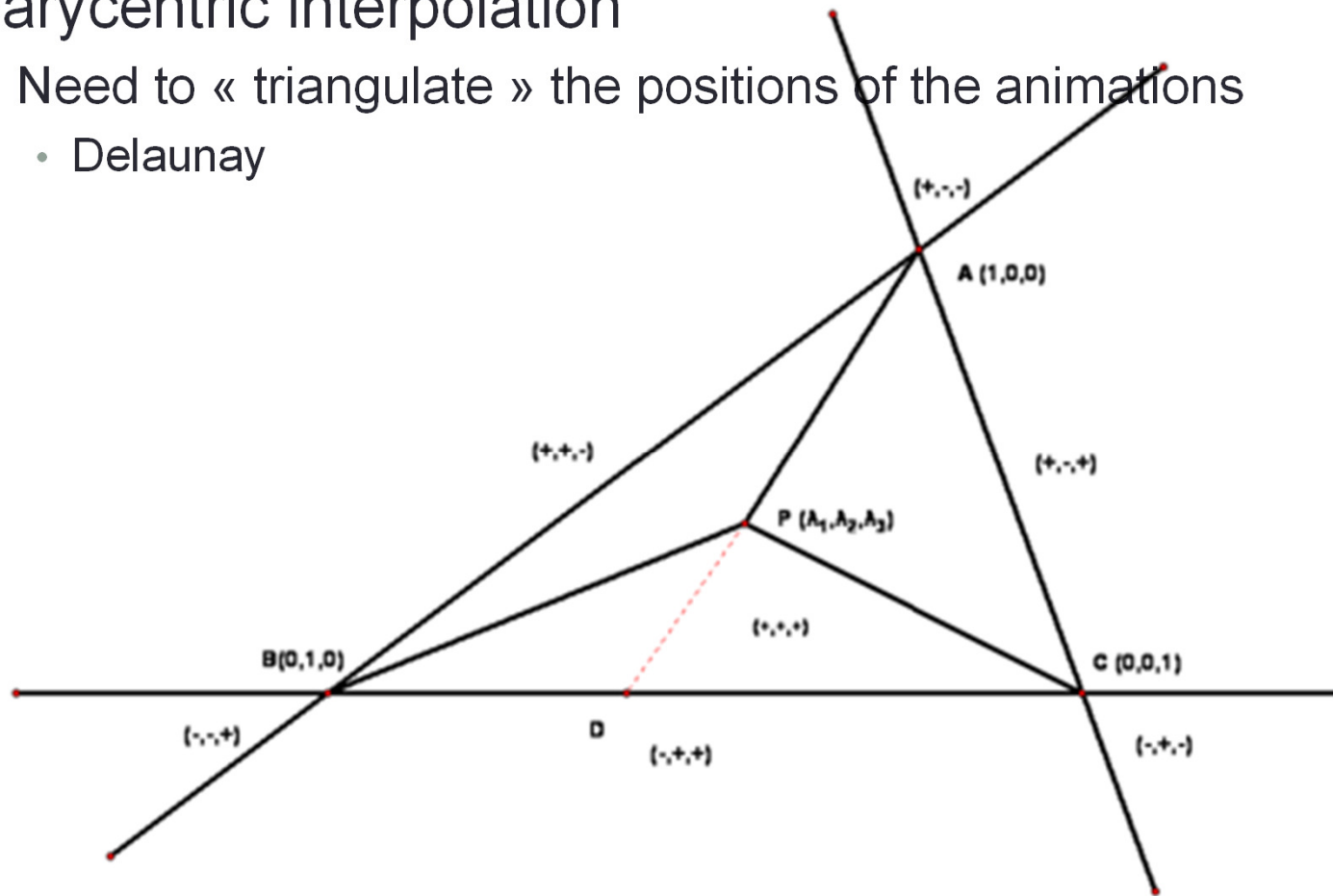
- Inverse distance weighting
 - $w_i = 1/\text{distance}$
 - Normalization of weights
 - Simple computing
- You have to define the position of the animations clips



$$Z(x) = \frac{\sum w_i z_i}{\sum w_i} = \frac{\frac{34}{1^2} + \frac{33}{2^2} + \frac{27}{2.5^2} + \frac{30}{3^2} + \frac{22}{4^2}}{\frac{1}{1^2} + \frac{1}{2^2} + \frac{1}{2.5^2} + \frac{1}{3^2} + \frac{1}{4^2}} = 32.38$$

Motion blending : Barycentric Int

- Barycentric interpolation
 - Need to « triangulate » the positions of the animations
 - Delaunay



Motion blending : RBF

- RBF : Radial Basis Function

$$y(\mathbf{x}) = \sum_{i=1}^N w_i \phi(\|\mathbf{x} - \mathbf{x}_i\|),$$

- Sum of N radial basis functions, each associated with a different center \mathbf{x}_i
- Weight w_i are computed with linear least square method

- Gaussian:

$$\phi(r) = e^{-(\epsilon r)^2}$$

- Multiquadric:

$$\phi(r) = \sqrt{1 + (\epsilon r)^2}$$

- Inverse quadratic:

$$\phi(r) = \frac{1}{1 + (\epsilon r)^2}$$

- Inverse multiquadric:

$$\phi(r) = \frac{1}{\sqrt{1 + (\epsilon r)^2}}$$

- Polyharmonic spline:

$$\phi(r) = r^k, \quad k = 1, 3, 5, \dots$$

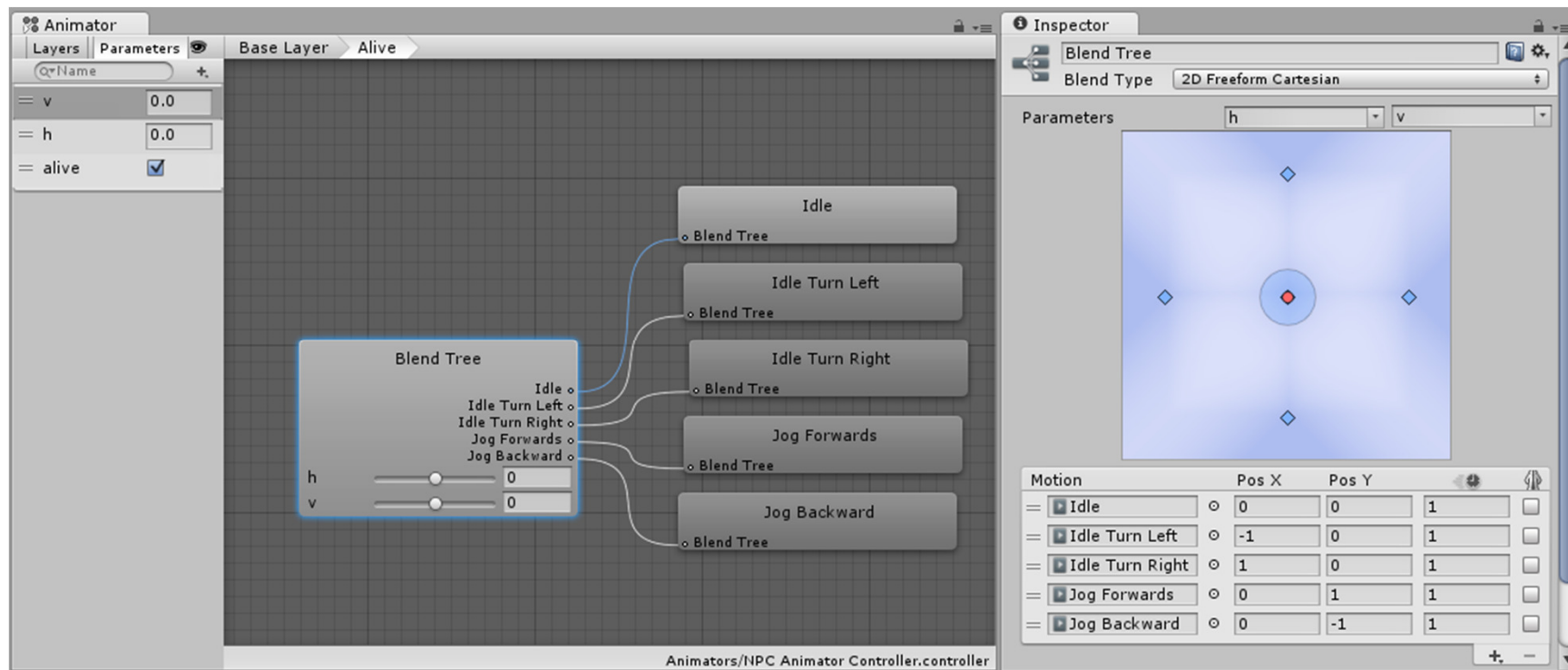
$$\phi(r) = r^k \ln(r), \quad k = 2, 4, 6, \dots$$

- Thin plate spline (a special polyharmonic spline):

$$\phi(r) = r^2 \ln(r)$$

Unity : Blend Tree

- Unity : blend tree
 - Finite State Machine
 - Motion blending with inverse distance weighting



Motion Field

- To get further from the interpolation techniques
 - Animations are set on space automatically by a k-nearest neighbor

$$d(m, m') = \sqrt{\begin{array}{l} \beta_{\text{root}} \|v_{\text{root}} - v'_{\text{root}}\|^2 + \\ \beta_0 \|q_0(\hat{u}) - q'_0(\hat{u})\|^2 + \\ \sum_{i=1}^n \beta_i \|p_i(\hat{u}) - p'_i(\hat{u})\|^2 + \\ \sum_{i=1}^n \beta_i \|(q_i p_i)(\hat{u}) - (q'_i p'_i)(\hat{u})\|^2 + \end{array}}$$

- Reinforcement Learning to produce the desired animation
 - States
 - Actions
 - Transition
 - Reward

+VIDEO

Conclusion

Data-driven motion synthesis

- FSM
- Motion graphs
- Motion blending / Motion interpolation
- Animation control

